

# Multi-source data Synergized Quantitative remote sensing production system (MuSyQ)

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# Outline

- 1. Background**
- 2. Objectives**
- 3. Framework**
- 4. Data Normalization**
- 5. MuSyQ Products**
- 6. Hardware**
- 7. Conclusions**

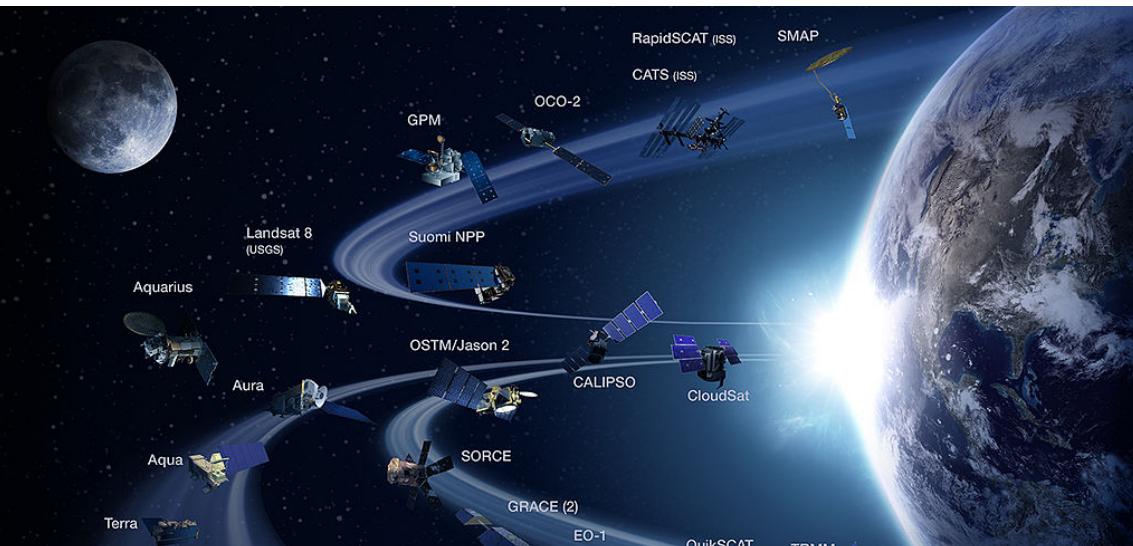


# 1. Background

AOGEOSS TG7, The National High Technology Research and Development Program of China under Grant 2013AA12A301 and 2012AA12A304; DRAGON 3 ID. 10680



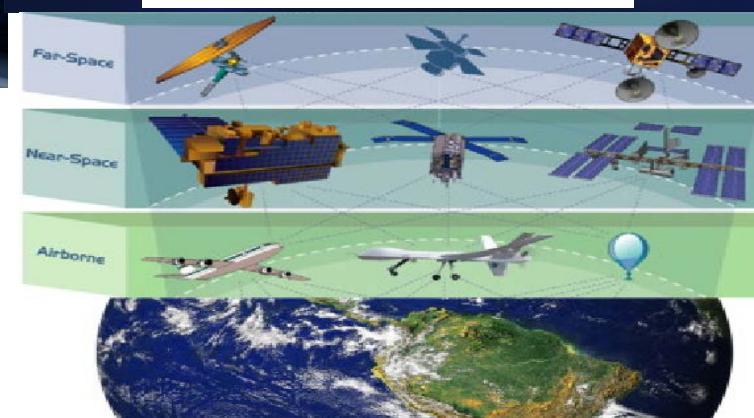
# 1.1 The explosive development of remote sensing data



NASA Earth Science Division Operating Missions



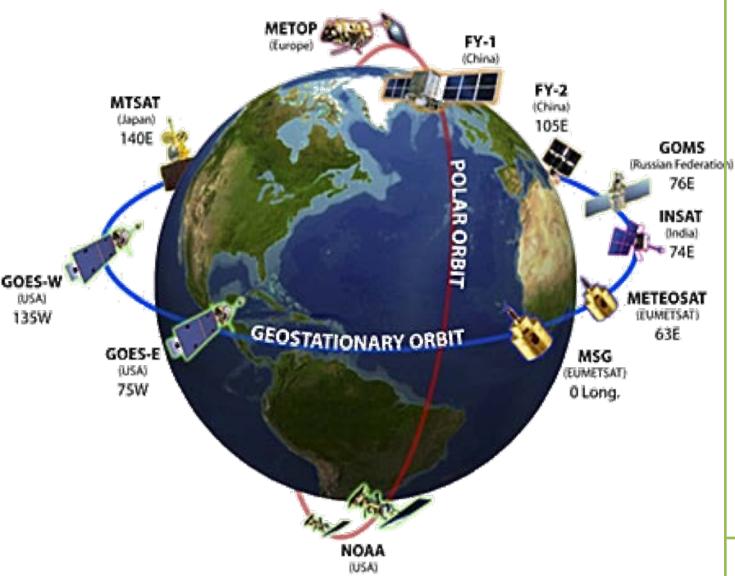
Chinese Missions



Ground-airborne-satellite  
*observations*

Satellites have been over **1000**  
Data amount in one DC : 100**TB**  
National data center : over **PB**  
Global data amount : over **EB**

# So Many RS data



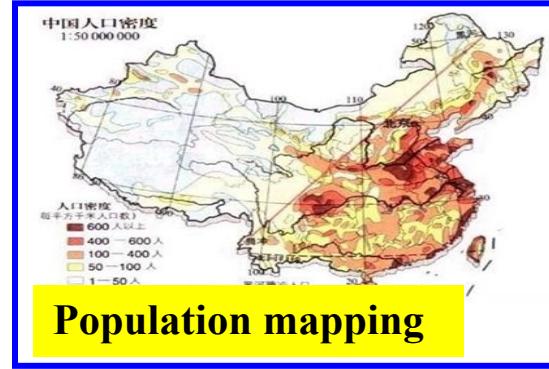
Sensor Type	Orbit	Data Examples	Characteristics
Optical		<b>High SR, Low TR</b>	
		<b>Moderate SR, Moderate TR</b>	
Others		<b>Low SR, High TR</b>	<b>Extra Information</b>

Greatly improve the quality of RS Products

# Increasing utilization of RS data

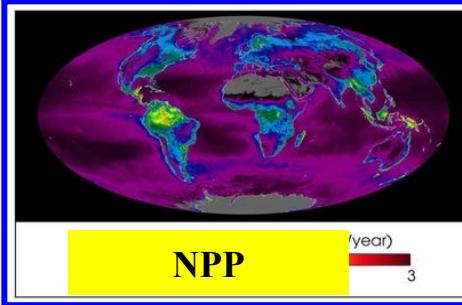
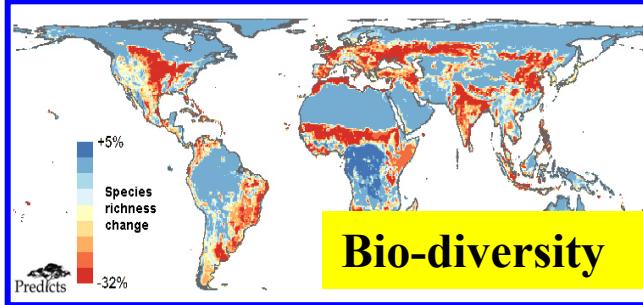


Data to **VALUE**

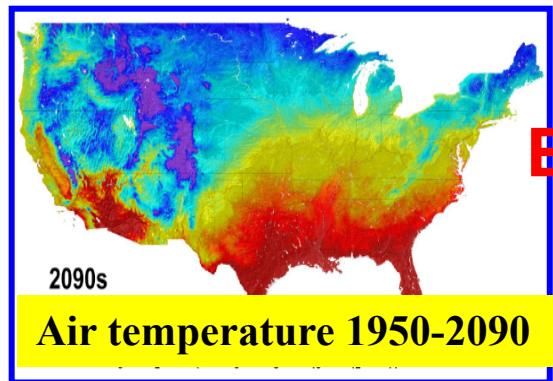


Economy

Guo et al., 2014. Sci. Bulletin of China;  
Brown et al., 2000;  
Predict Project;  
NASA Earth Exchange  
NASA:



Ecology



Environment

.....

# Chinese satellite missions

- **FengYun (FY): meteorology**
- **HaiYang (HY): ocean**
- **Huanjing (HJ): environmental monitoring**
- **ZiYuan (ZY): resource monitoring, surveying and mapping**
- **GaoFen (GF): high spatial resolution observing**
- **Satellites for hydrology and carbon observing**
- **And more**
- **Over 40 satellites in next 5 years**
- **Include visible, infrared, microwave, lidar, hyperspectra, gravity, and everything**

# 1.2 Requirements of RS products from applications

- Existing land surface remote sensing products
  - MODIS, MERIS, FY3-MERSI/VIRR, AVHRR...
  - From single satellite data
  - Usually not very consistent
  - Temporal resolution usually in 16 days is restricted because of clouds and aerosol
- Requirements from applications
  - Higher temporal resolution RS products are better
  - Consistent of RS products

# Chances

- ❑ More satellites → more observations
- ❑ Wider swath → shorter revisiting period



Monthly observation without clouds are possible

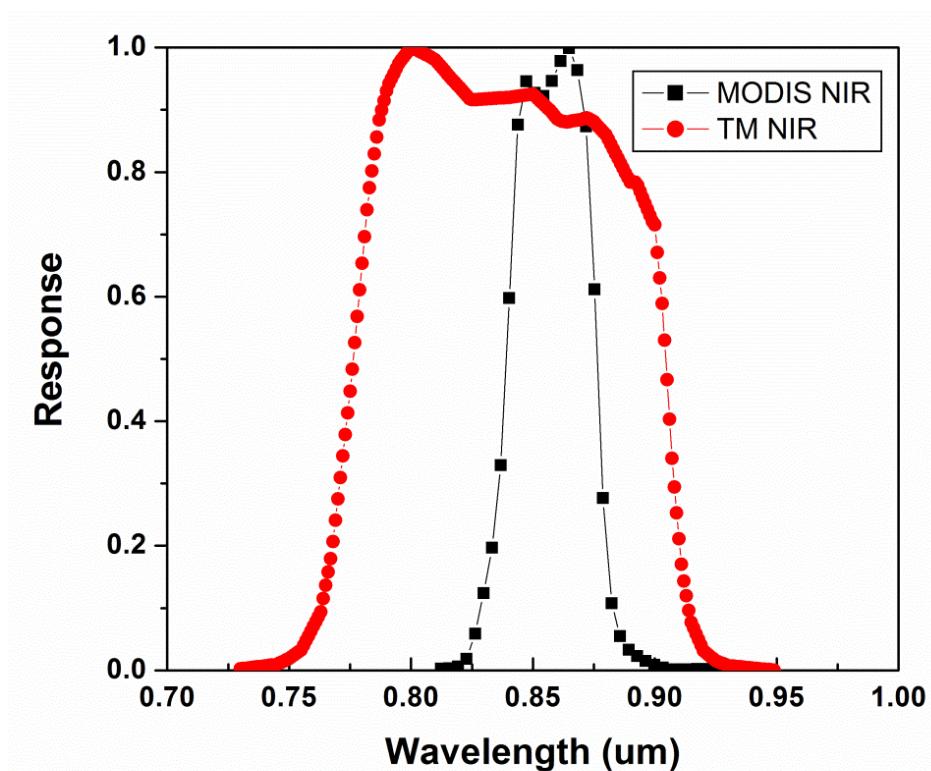


Finer applications on agriculture, environmental monitoring,  
land surveying etc.

# 1.3 What are the problems?

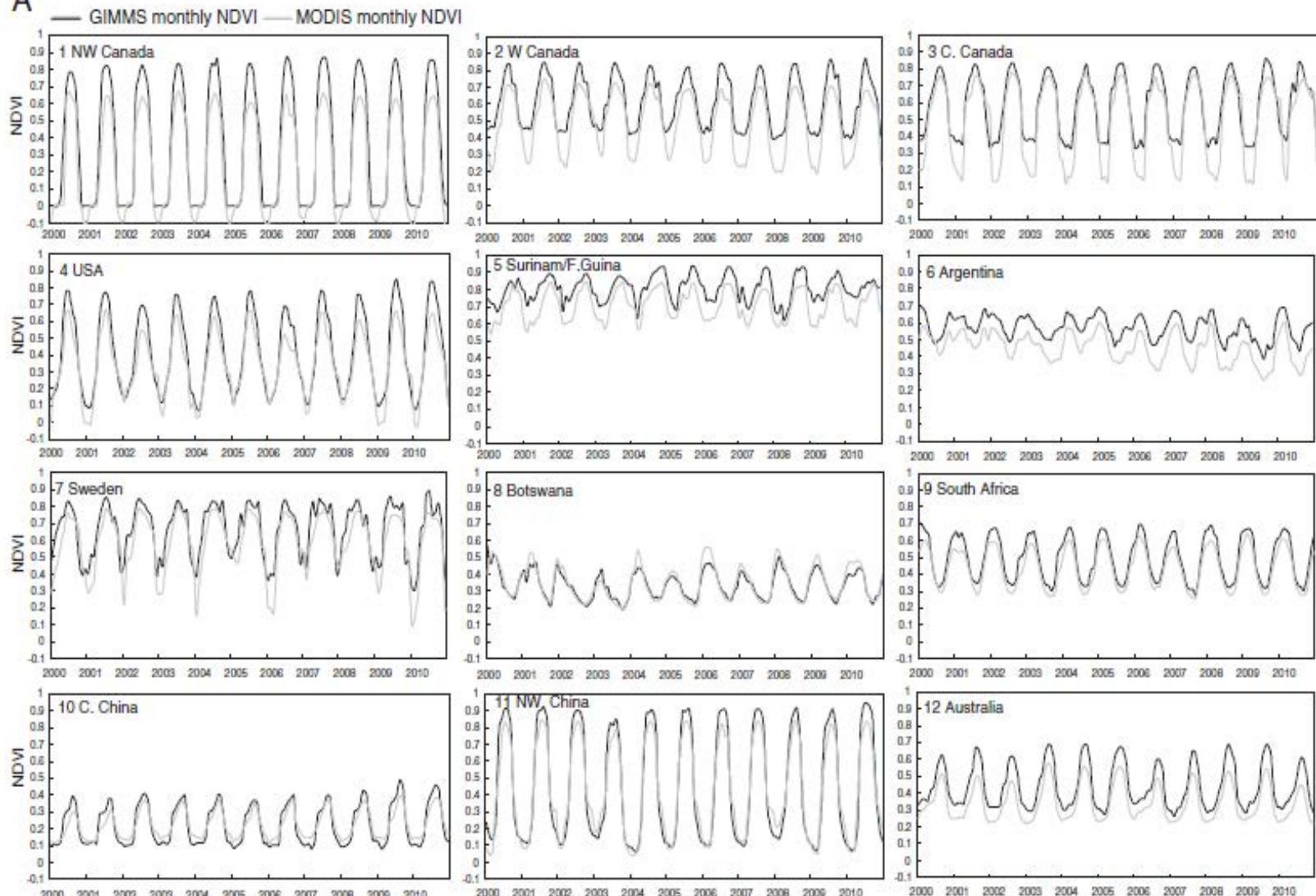
Theoretically, it is easy as long as similar data have:

- The same position
- The same spectra
- The same radiometric capability
- Atmospheric effects free



Spectra Difference

A



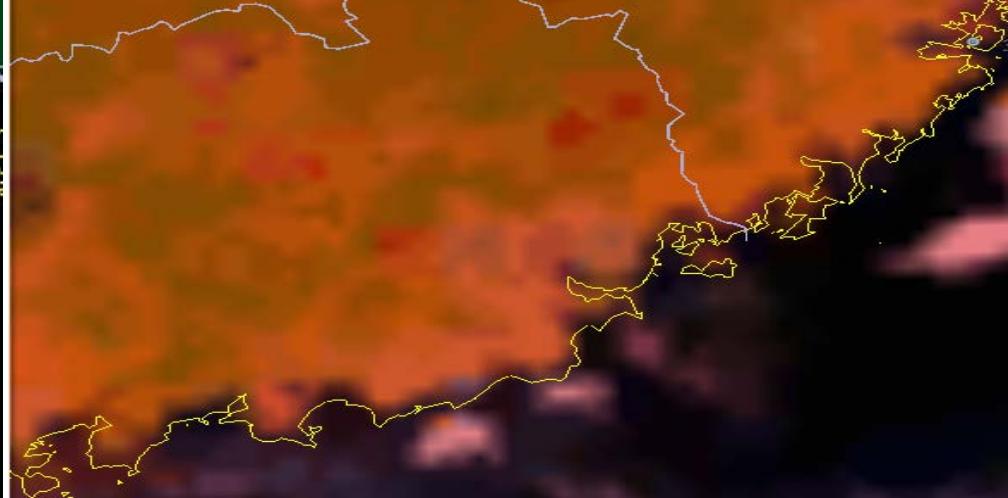
**Fig. 6.** (A) Time series of monthly GIMMS and MODIS NDVI (2000–2010) for selected regions (Fig. 4G) and (B) the corresponding scatterplots including regression slope, intercept and correlation coefficient. Pixels influenced from snow cover (Fig. 6A1) are excluded in the correlation analysis (Fig. 4) and in the Fig. 6B1 scatterplot.

MODIS-AVHRR  
NDVI Comparison

Radiometric  
Difference



FY3A



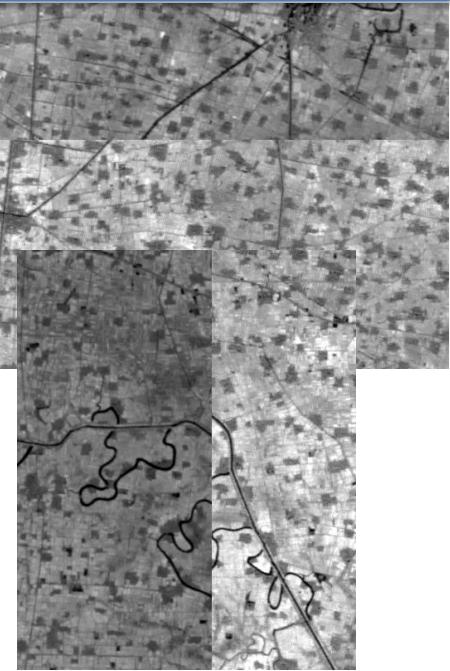
AVHRR

### Geometric Difference

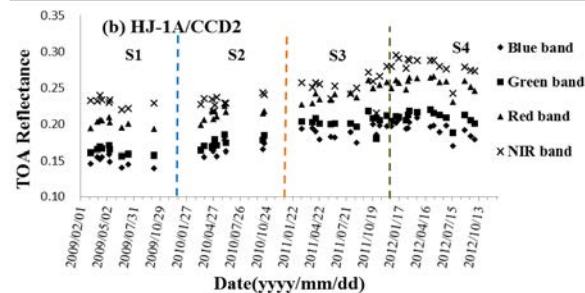
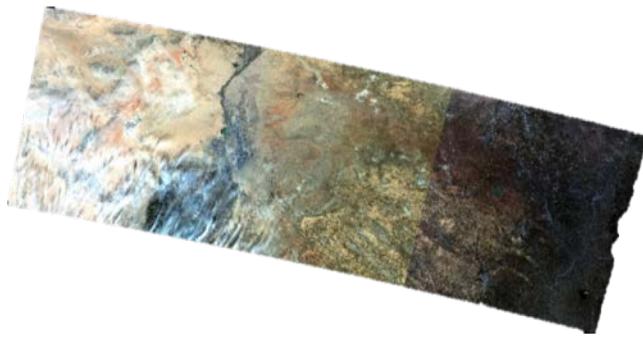
Sat/Sensor	1	2	3	4	5	6	7	8	9	10
N17/AVHRR	5.1	6.9	6.5	5.4	5.5	5.9	5.3	6.3	6.4	6.2
FY3A/VIRR	6.7	3.7	4.6	2.6	4.5	3.8	3.5	3.2	2.7	6.1
FY3A/MERSI	2.7	2.3	1.7	2.2	3.3	3.2	2.4	2.8	3.1	1.9
FY2E/VISSR	12.9	19.3	17.2	13.0	17.9	16.5	17.4	13.5	16.3	18.1
MTSAT2	3.51	4.98	4.24	4.06	5.56	4.56	5.23	4.1	4.3	4.56
MSG2	1.75	1.8	1.67	1.6	1.72	1.6	1.66	1.51	1.43	1.77
GOES	1.56	1.59	1.71	1.53	1.49	1.41	1.5	1.63	1.76	1.68

# Challenges

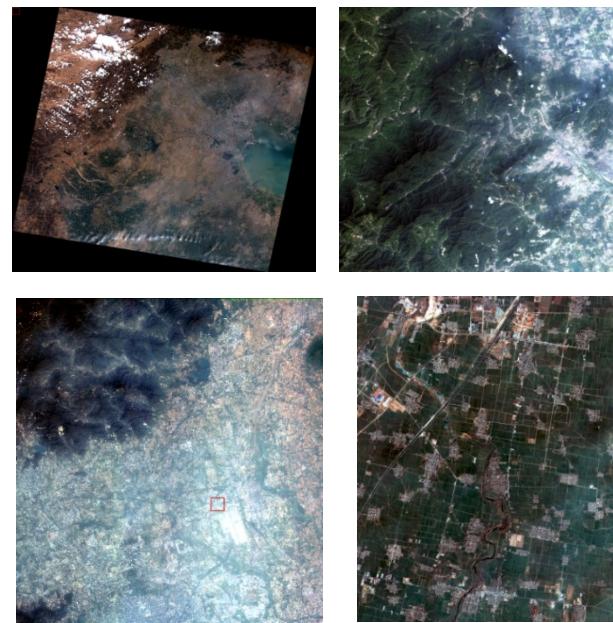
Geolocation bias



Radiometric bias



Atmospheric effect



## **2. Objectives**



Trend: long-term environmental products leveraging off the advantages of multiple instruments

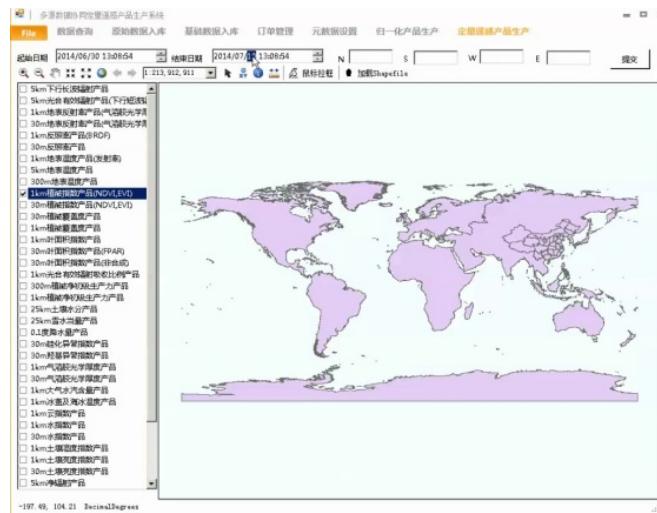
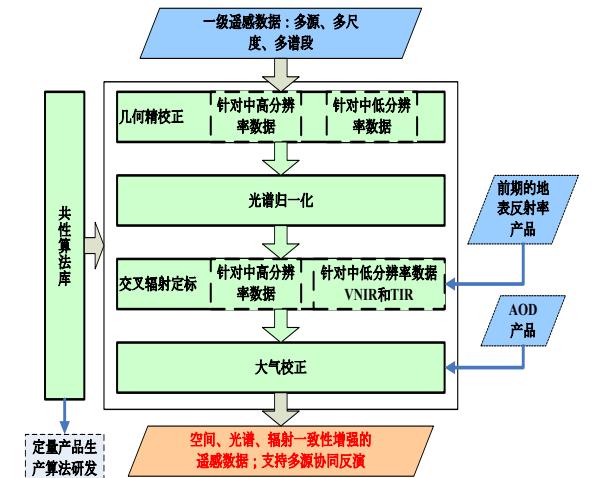
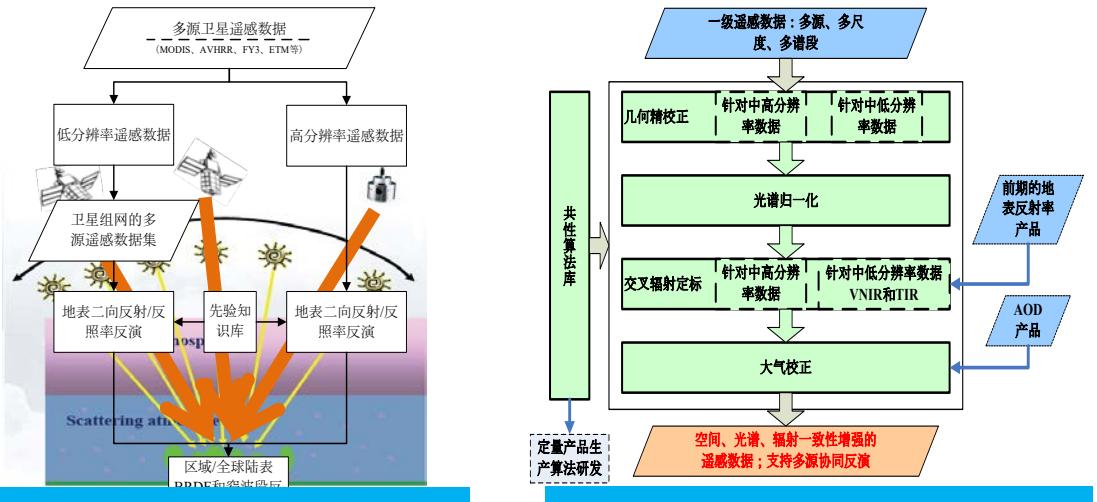
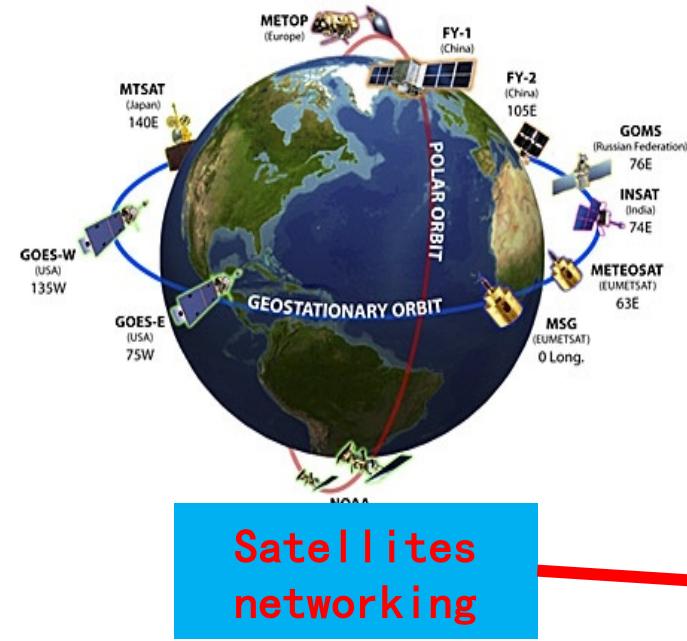
- Townshend et al. (2002)
  - It is to be hoped that creation of long-term environmental products leveraging off the advantages of multiple instruments will become increasingly common in the future.

- Similar data together to improve the temporal frequency**
- Multi-scale data together to improve the spatial resolution**
- Multi-source data together to introduce extra information**

### **3. Framework**



# The Framework



M  
U  
S  
Y  
Q

Parameters retrieving using data from multi-sensors

Automation

High performance computing

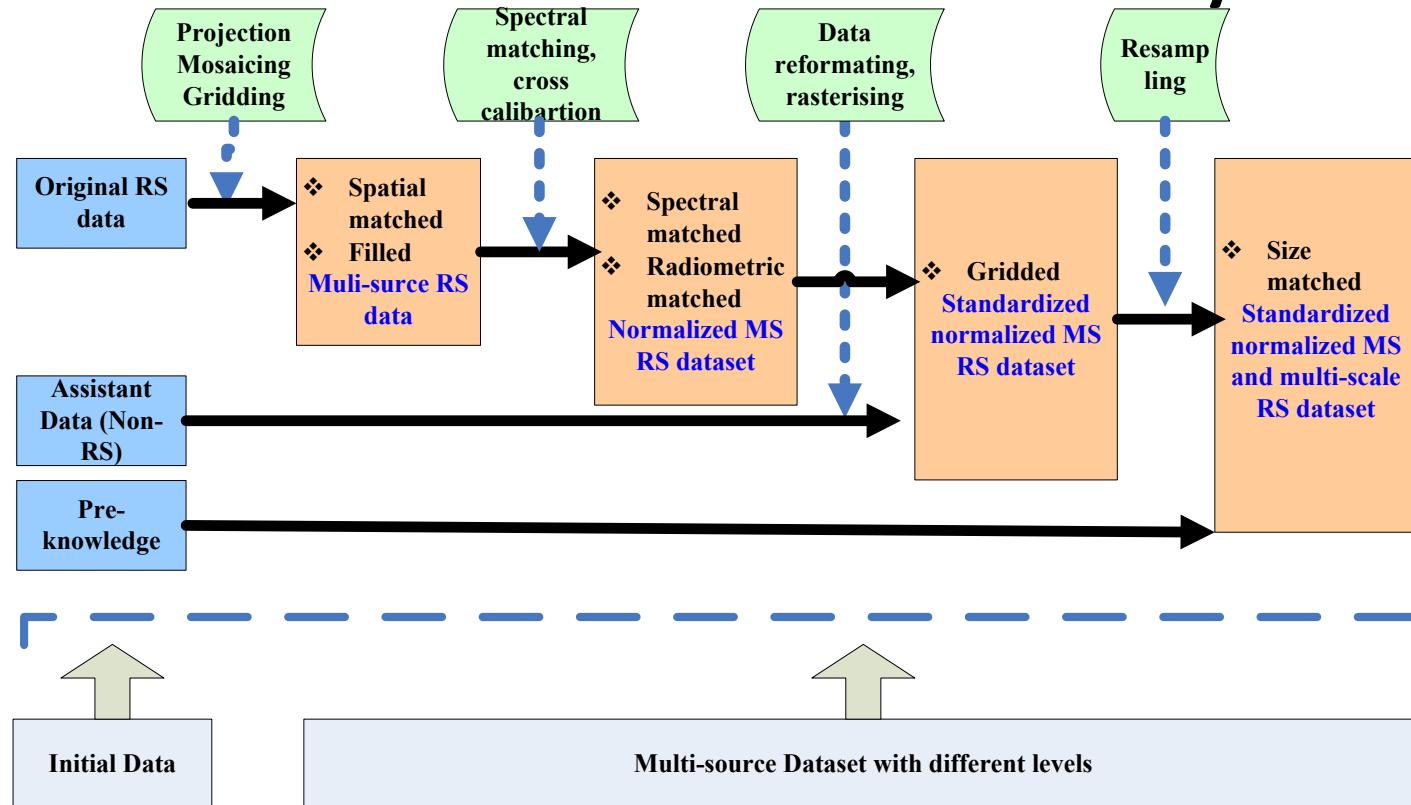
## Multi-source and Multi-scale RS Data Normalization Processing System

### 4. Data normalization



# Objectives

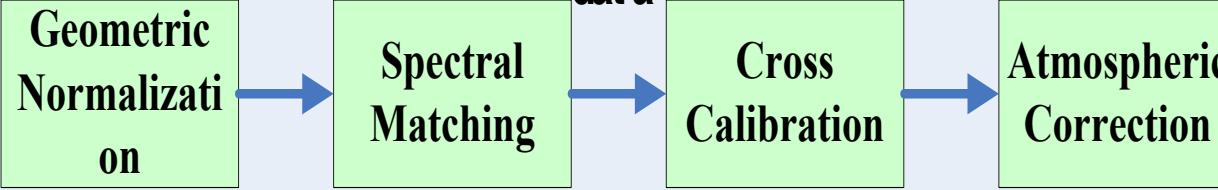
- Develop algorithms for spectral, geometric, and radiometric normalization
- Generate multi-source RS dataset with very high consistency on spectra, geometry, and radiometry
- Global observation without clouds in 5 days



# The Framework for data normalization

**Multi-source and Multi-scale RS Data Normalizing Processing system Framework**

**Key algorithms for automated processing of MS and Multi-scale RS data**



**Assistant Data Normalization**

**Common data processing algorithms**

**Standardized normalized MS and Multiscale RS dataset**

# General Ideals

- Choosing high quality data as the base data for normalization
  - Polar Moderate to low: **EOS-MODIS, Landsat-TM/ETM+**
  - Geostationary: **EOS-MODIS**
- Using large amount of knowledgebase to assure the efficiency and the implementability
  - MODIS surface reflectance
  - DEM
  - Land cover dataset
- Considering the applicability for data from multi-sensor

# Key algorithms

- Geometric normalization
- Spectral matching
- Cross calibration
- Atmospheric correction

## □ Requirements:

- For multi-source and multi-scale RS data
- Automated
- Highly efficient



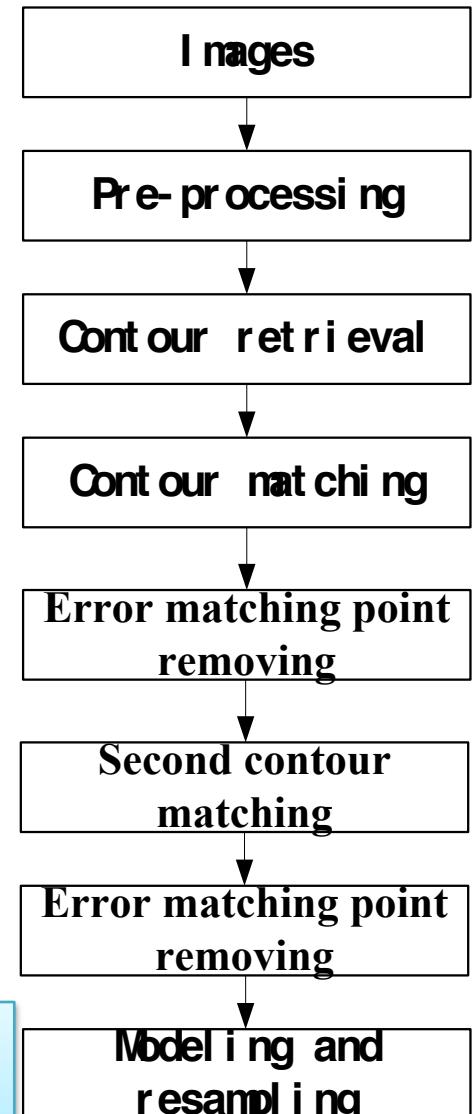
Routinized  
Operational  
Global

# (1) Geometric registration

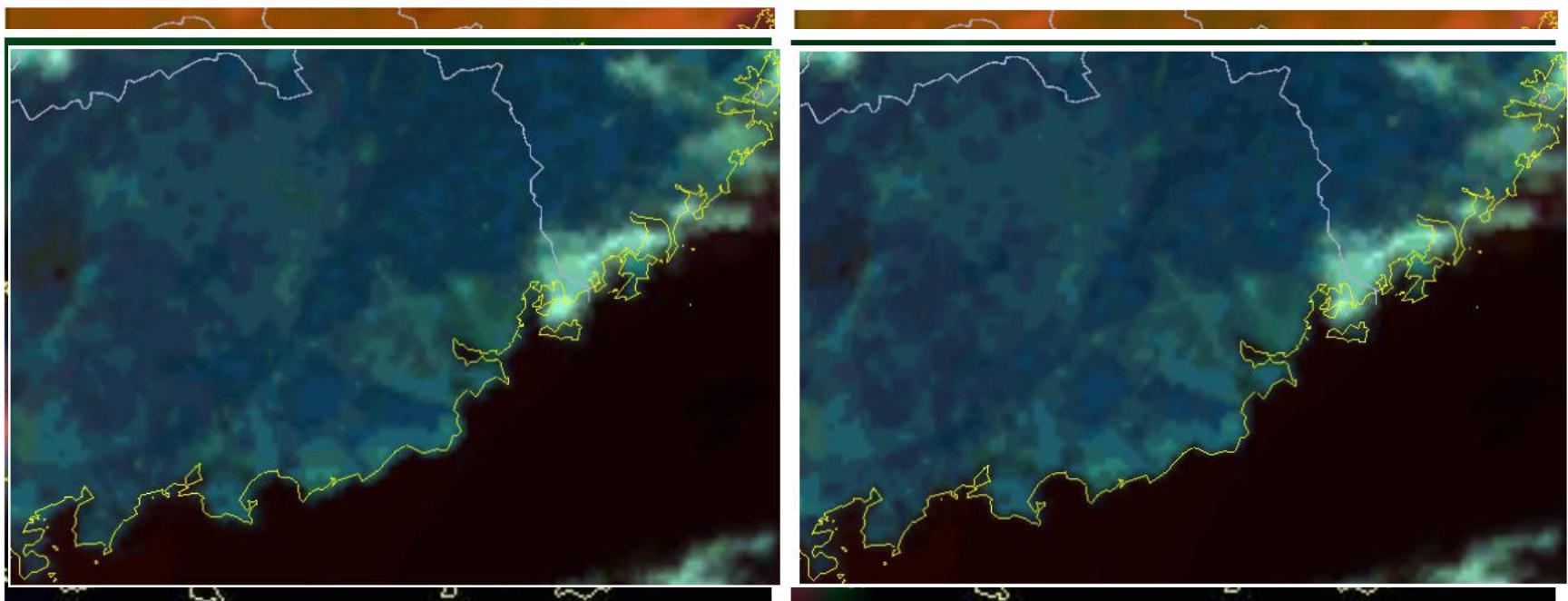


Keys

Use MODIS as base images for  
image to image registration

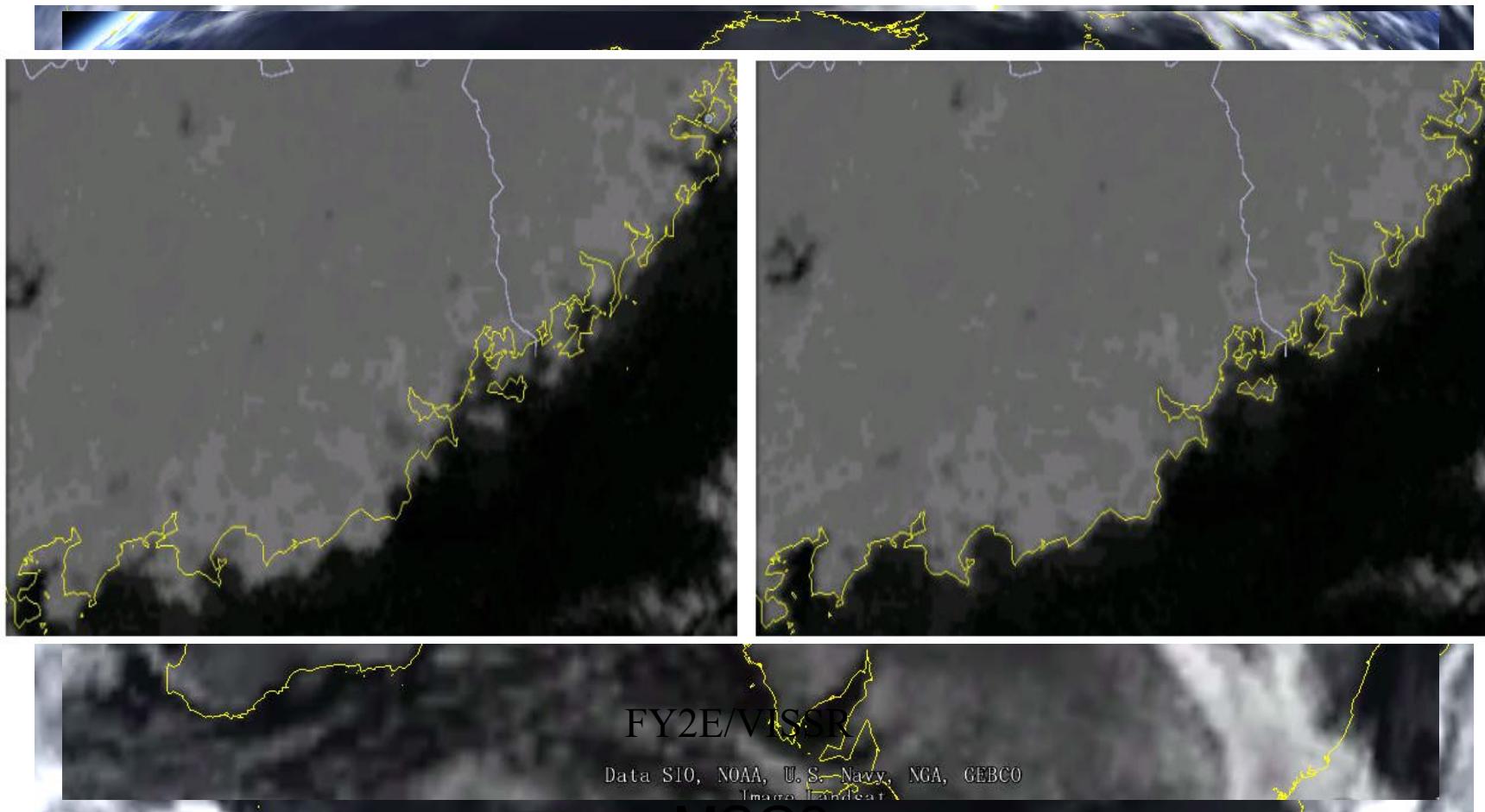


# Polar data Results



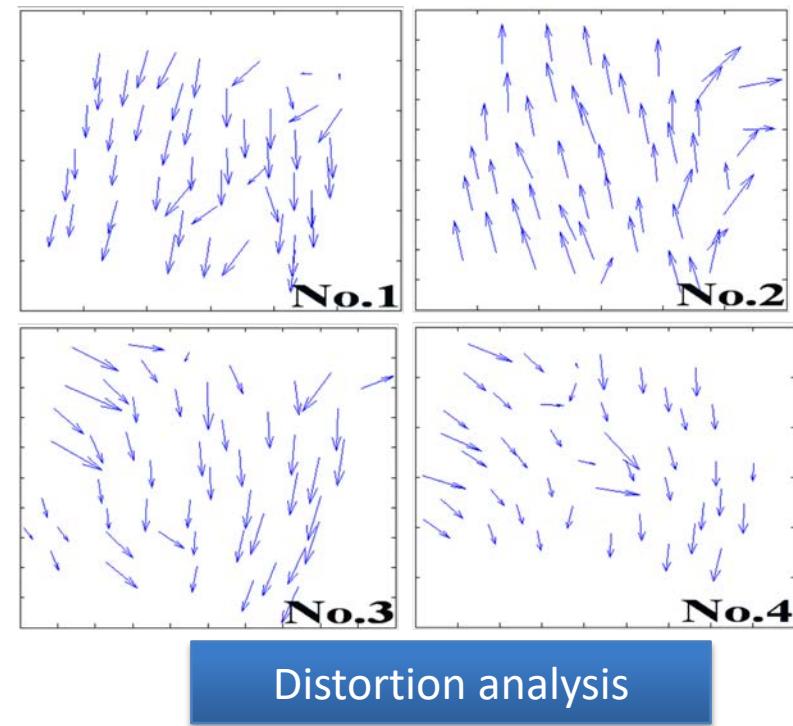
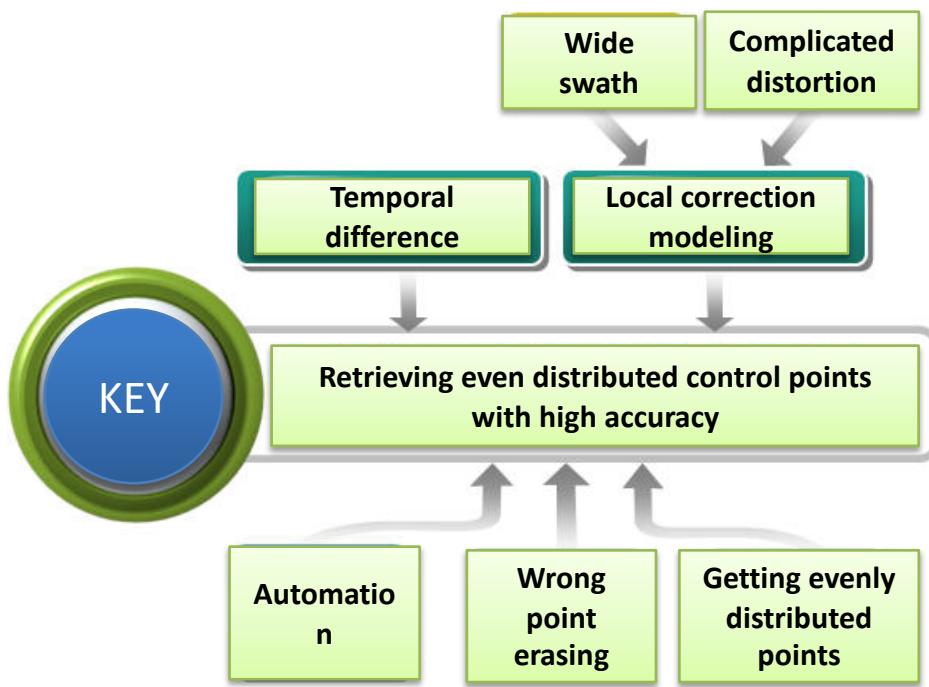
FFYAAVERS

# Geostationary data results

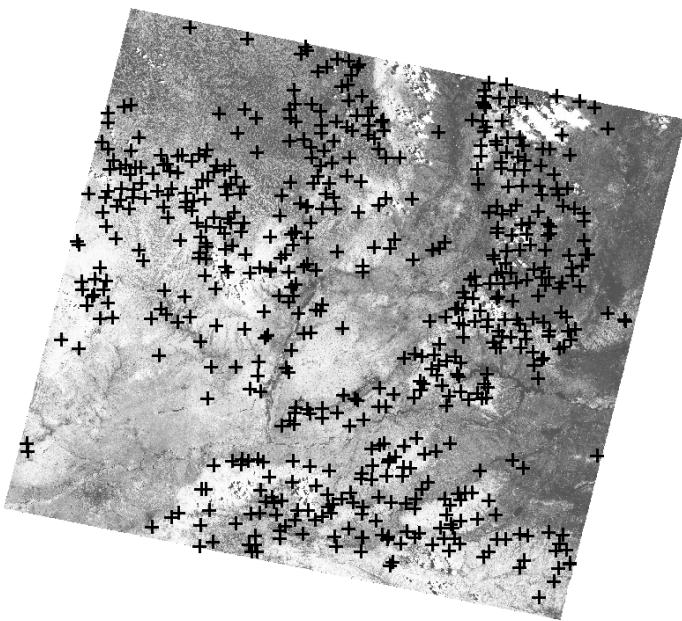


MSG2  
Meteosat2  
GOES-15  
GOES-13

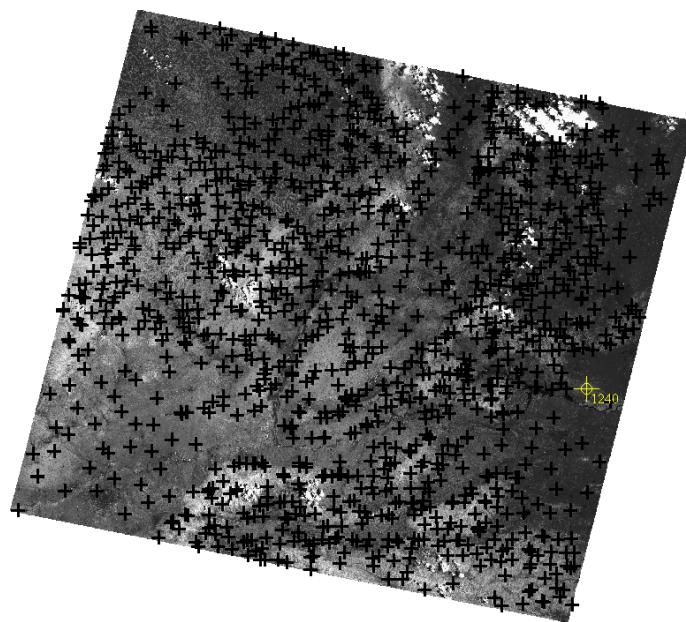
# Geometric registration-MH



# The distribution of controlling points

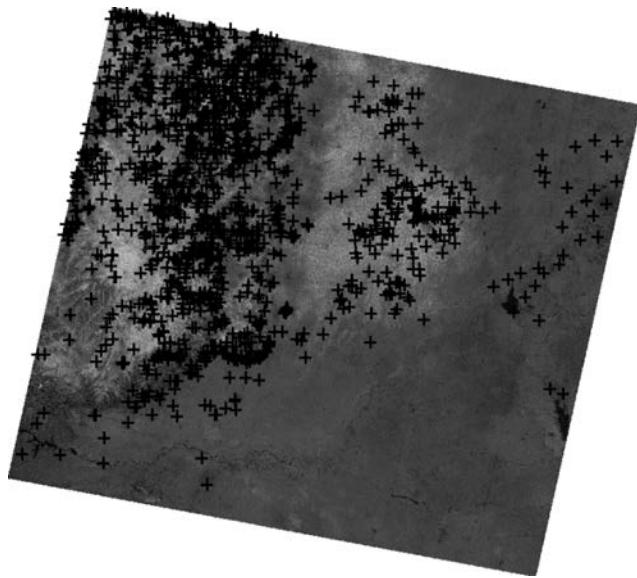


SIFT

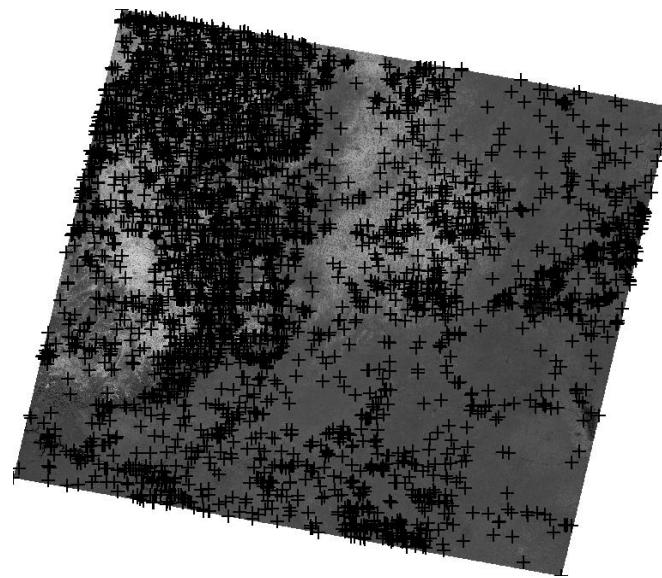


The proposed algorithm

# Getting rid of the inaccuracy points

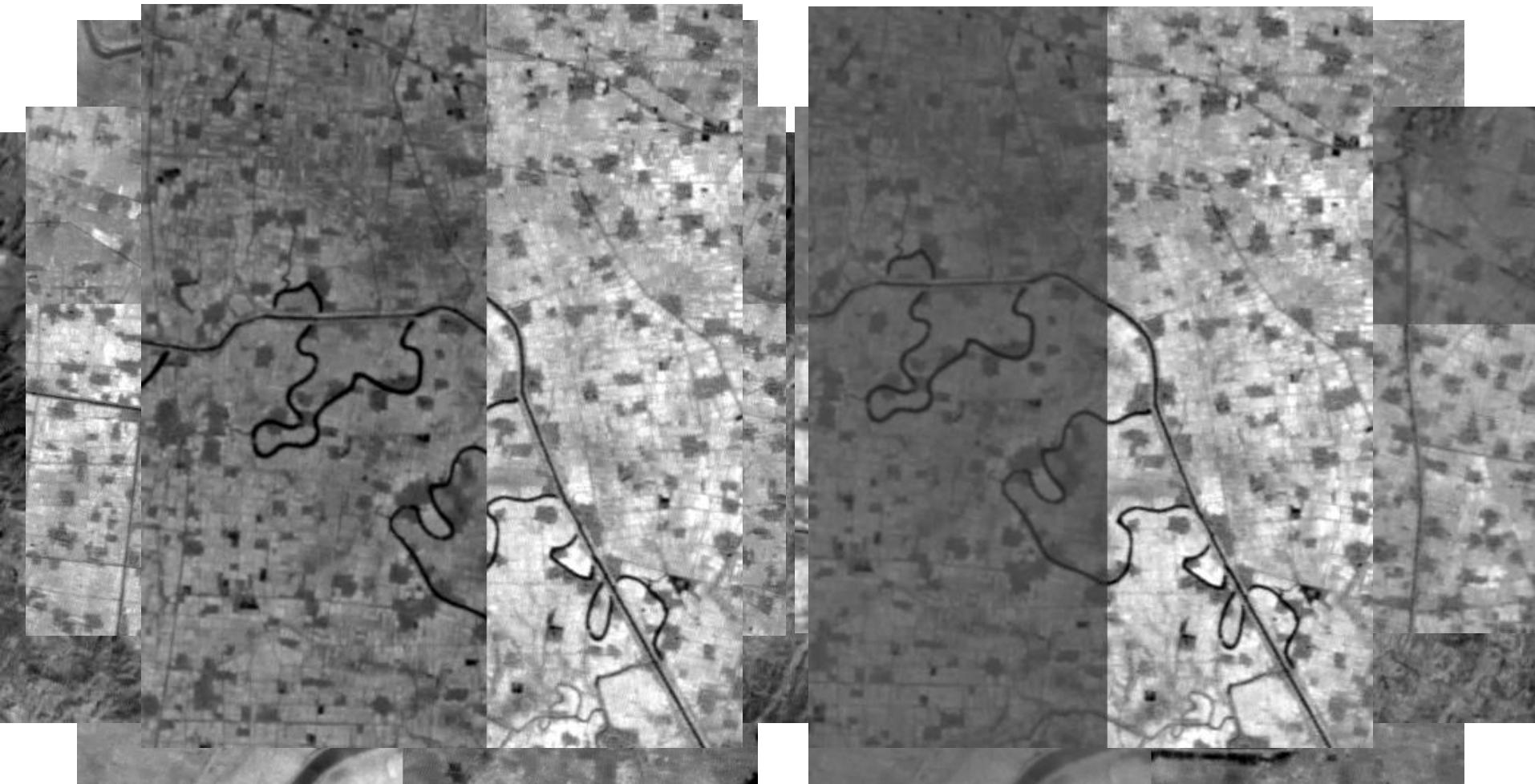


RANSAC



The proposed algorithm

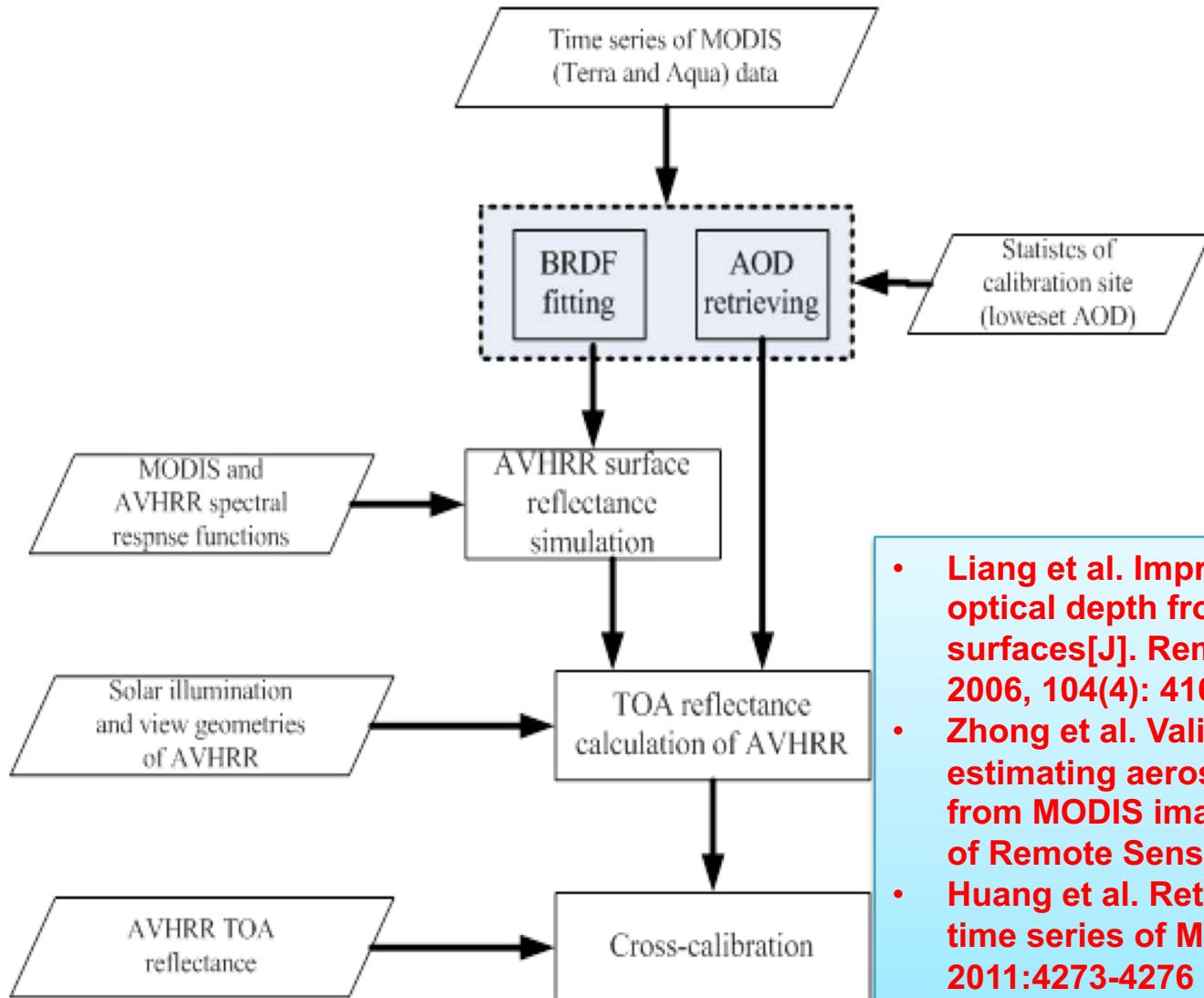
# Moderate to high resolution data



Before correction

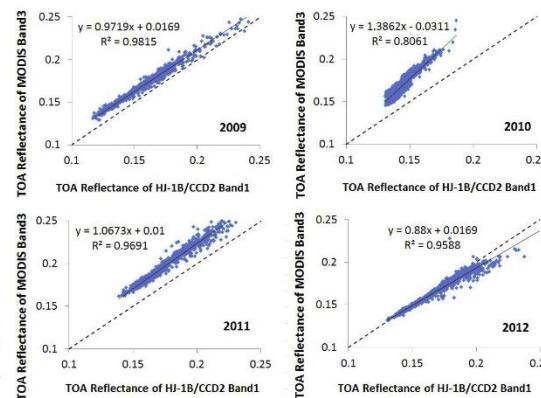
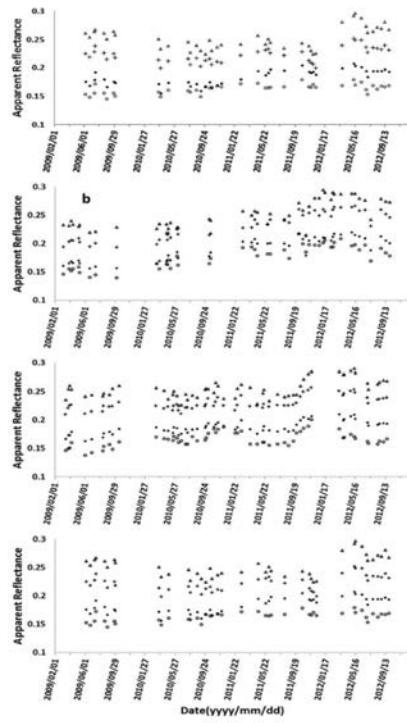
After correction

## (2) Cross calibration

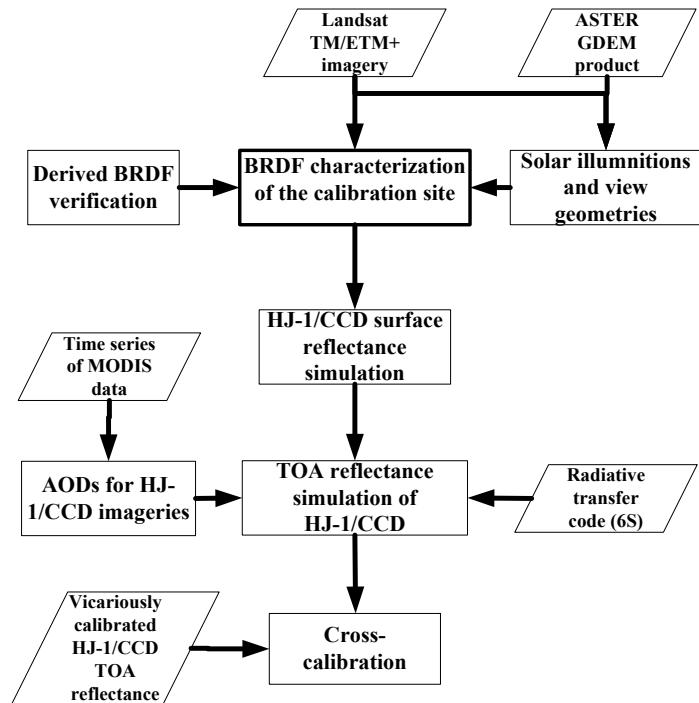


- Liang et al. Improved estimation of aerosol optical depth from MODIS imagery over land surfaces[J]. *Remote Sensing of Environment*, 2006, 104(4): 416-425.
- Zhong et al. Validating a new algorithm for estimating aerosol optical depths over land from MODIS imagery[J]. *International Journal of Remote Sensing*, 2007, 28(18): 4207-4214.
- Huang et al. Retrieving BRDF Of desert using time series of MODIS imagery IGARSS 2011:4273-4276

# Radiometric cross-calibration-MH



✓ Zhong B, Zhang Y, Du T, et al.  
**Cross-Calibration of HJ-1/CCD Over a Desert Site Using Landsat ETM Imagery and ASTER GDEM Product[J]. IEEE TRANSACTIONS ON GEOSCIENCE AND REMOTE SENSING, 2014, 52(11), 7247-7263.**



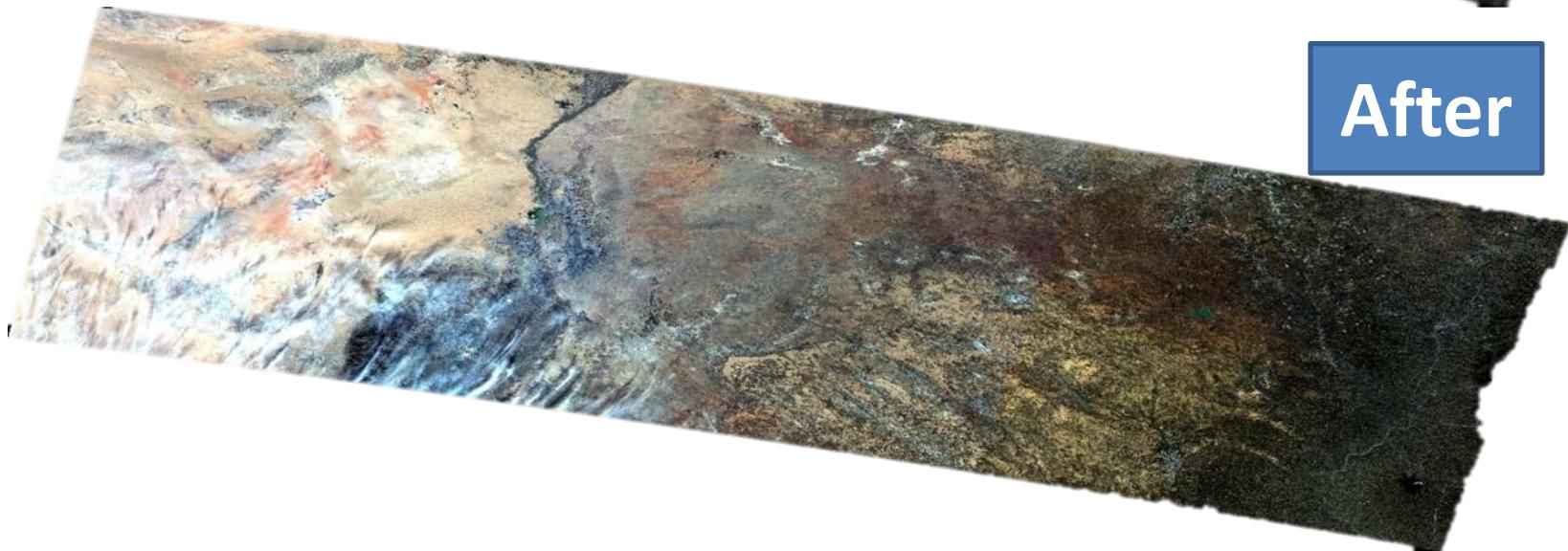
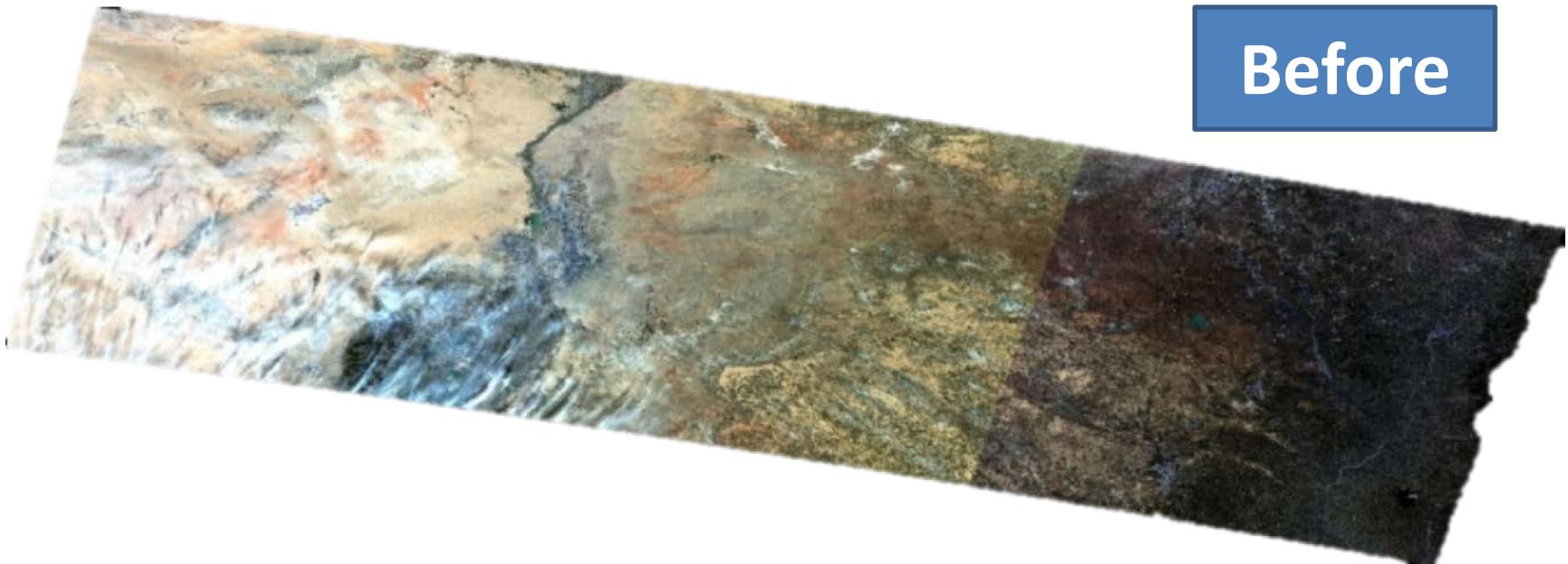
# Validation

Official calibration  
over 5%

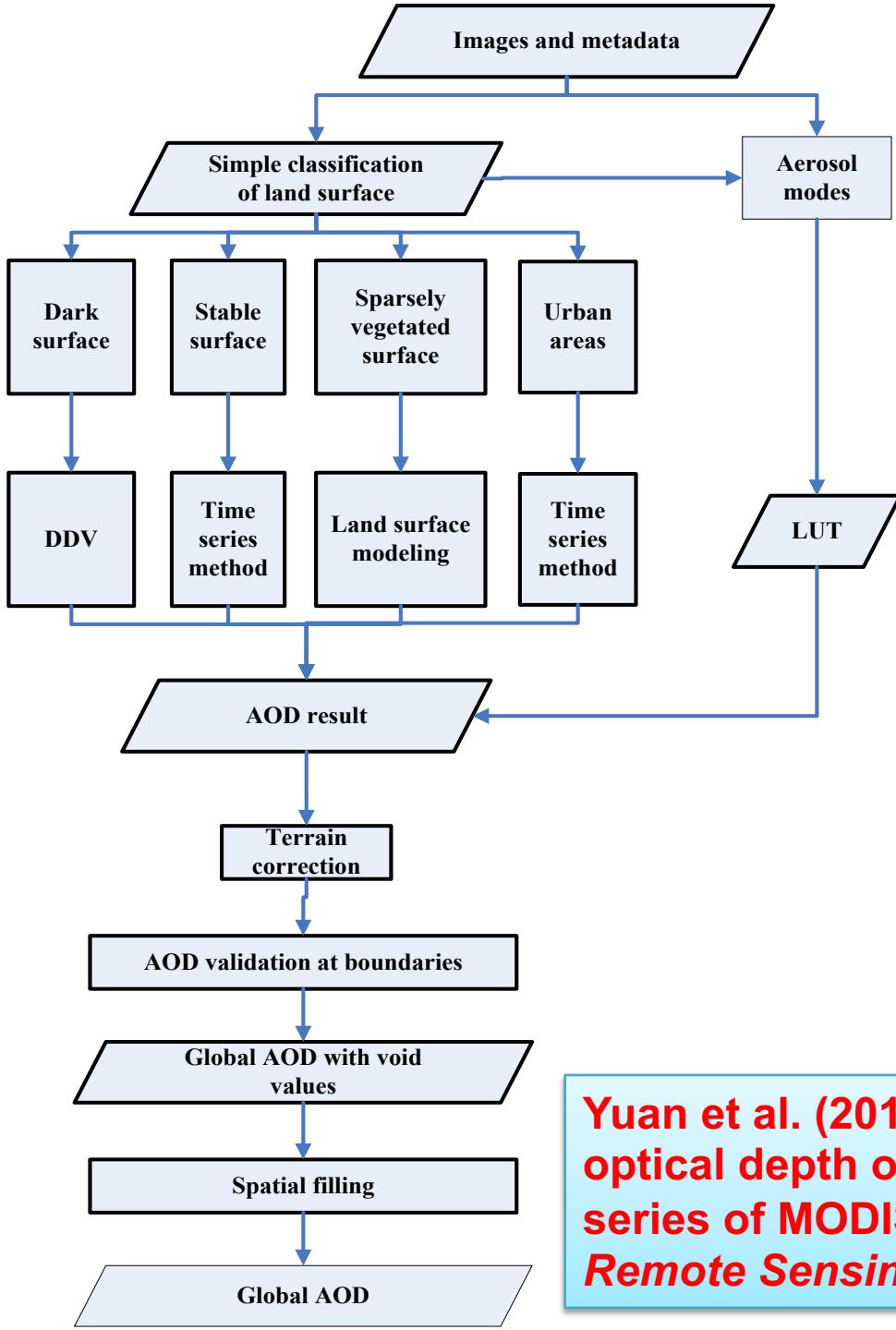
Date(YYMMDD)	Satellite/ sensor	band	Offset	CCC*	GCC\$	TOA radiance by CCC	TOA radiance by GCC	TOA radiance by GM#	Error by CCC	Error by GCC
100811	1A/CCD1	Band1	7.3250	0.8100	0.6925	114.3622	132.5310	108.7449	0.0516	0.2187
		Band2	6.0737	0.8155	0.7438	111.3873	121.5427	110.5042	0.0079	0.0998
		Band3	3.6123	1.0807	0.9636	97.2444	108.6270	101.1343	0.0384	0.0740
		Band4	1.9028	1.0544	1.0545	67.0518	67.04755	70.85944	0.0537	0.0537
110928	1B/CCD2	Band1	2.2219	0.8492	0.8352	96.4577	98.03807	96.3980	0.0006	0.0170
		Band2	4.0683	0.8761	0.7925	92.1127	101.4051	93.1440	0.0110	0.0887
		Band3	5.2537	1.1585	1.1316	87.7656	89.7307	85.3340	0.0284	0.0515
		Band4	6.3497	1.0941	1.0578	60.8876	62.7592	59.2300	0.0279	0.0596
100812	1A/CCD2	Band1	4.6344	0.9794	0.9230	107.1702	113.4408	110.8736	0.0334	0.0231
		Band2	4.0982	0.9016	0.9399	108.1073	103.8745	107.0163	0.0101	0.0293
		Band3	3.7360	1.2163	1.3093	100.9593	94.0571	96.05768	0.0510	0.0208
		Band4	1.3178	1.2564	0.7385	68.3588	115.3811	66.1060	0.0340	0.7453
09025	1B/CCD1	Band1	1.6146	0.4963	0.4817	103.4974	106.5854	105.879	0.0230	0.0066
		Band2	6.2193	0.5257	0.4728	102.2621	113.008	105.094	0.0276	0.0753
		Band3	6.2193	0.6959	0.6262	96.0534	106.0525	97.1140	0.0110	0.0920
		Band4	2.8302	0.7457	0.7007	68.5089	72.7268	66.4500	0.0300	0.0944

The proposed method  
less than 5%

# Radiometric cross-calibration



# (3) Atmospheric correction

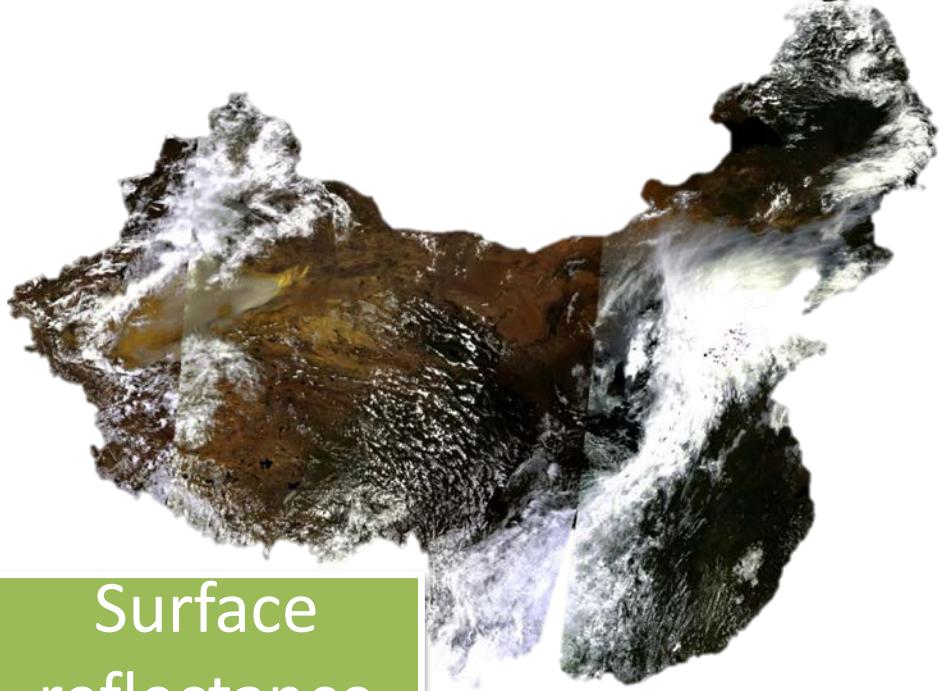


- For general atmospheric conditions
- For general land surfaces, especially for bright surface and sparsely vegetated surface
- For any type of RS data including data without shortwave infrared band
- Gap filled and no void values
- Double checked and validated at boundaries

**Yuan et al. (2014, November). Retrieval of aerosol optical depth over bare soil surfaces using time series of MODIS imagery. In SPIE Asia Pacific Remote Sensing (pp. 92591Q-92591Q).**



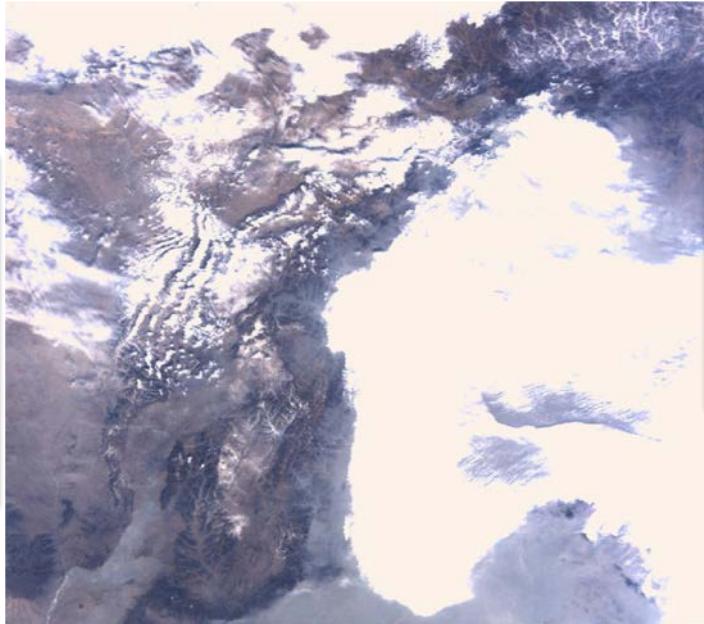
TOA  
reflectance



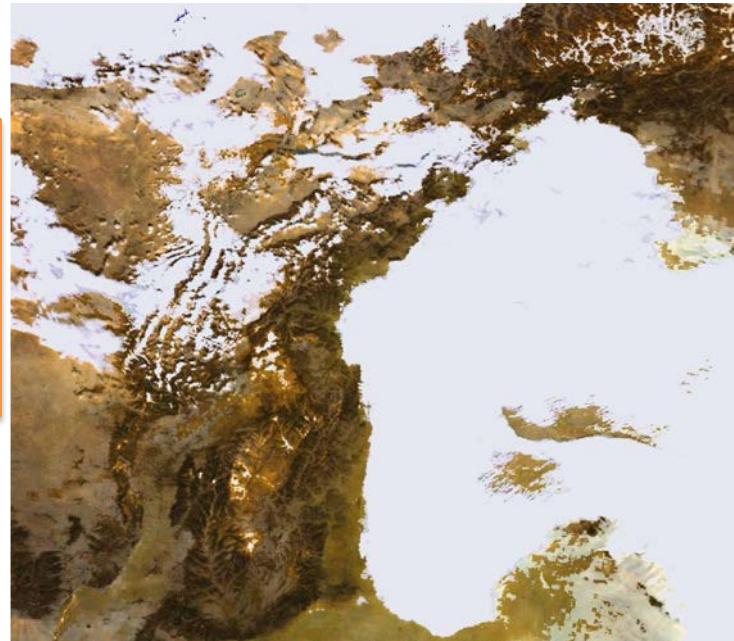
Surface  
reflectance

1  
year's  
result  
in N  
CHN

TOA



BOA



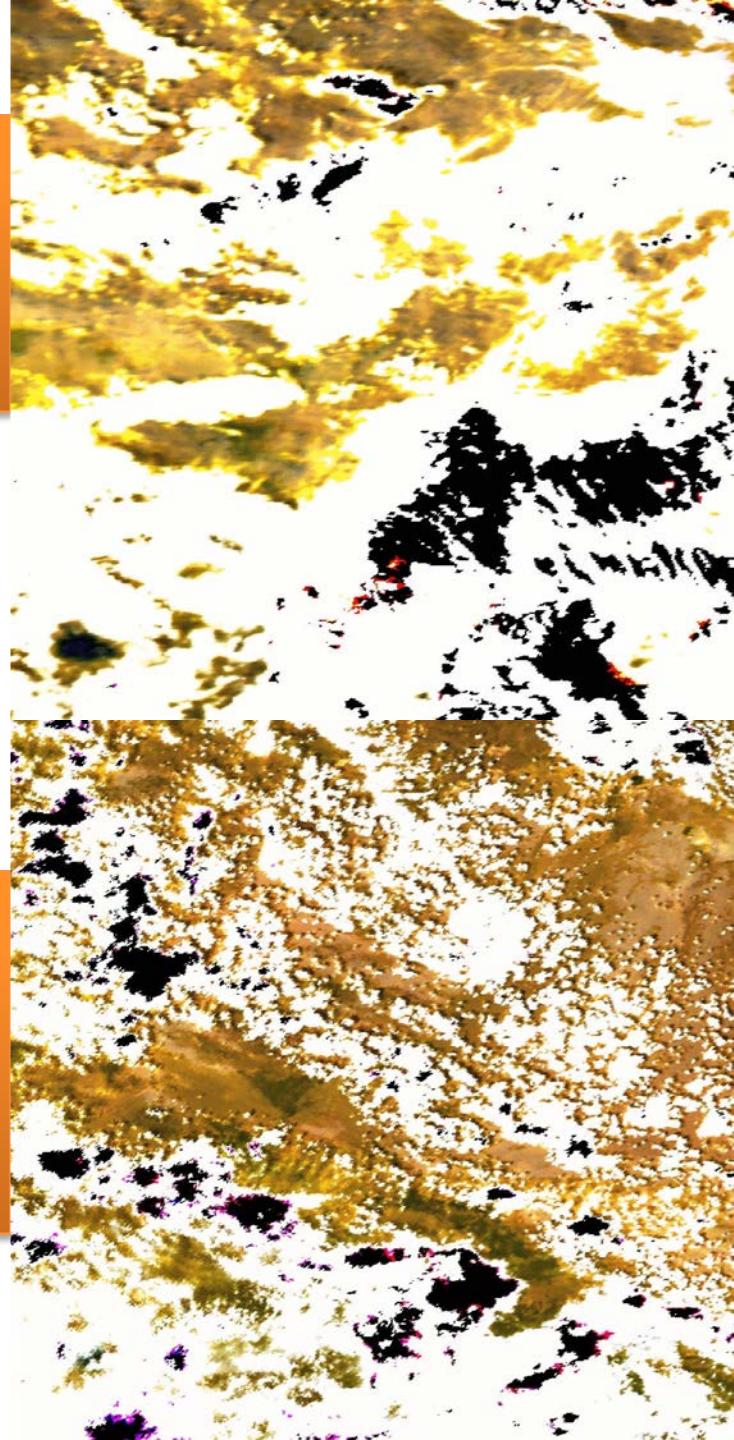
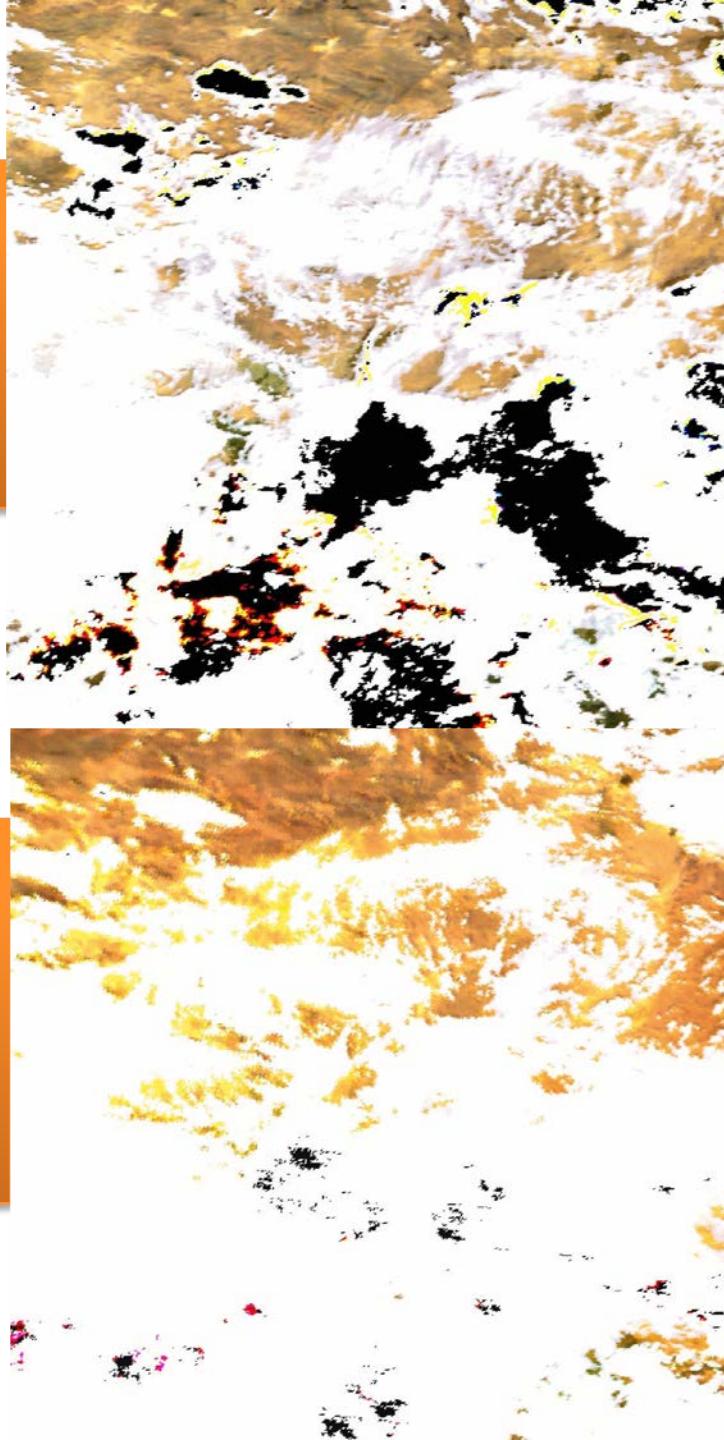
# Surface Reflectance

FY3A/MERSI

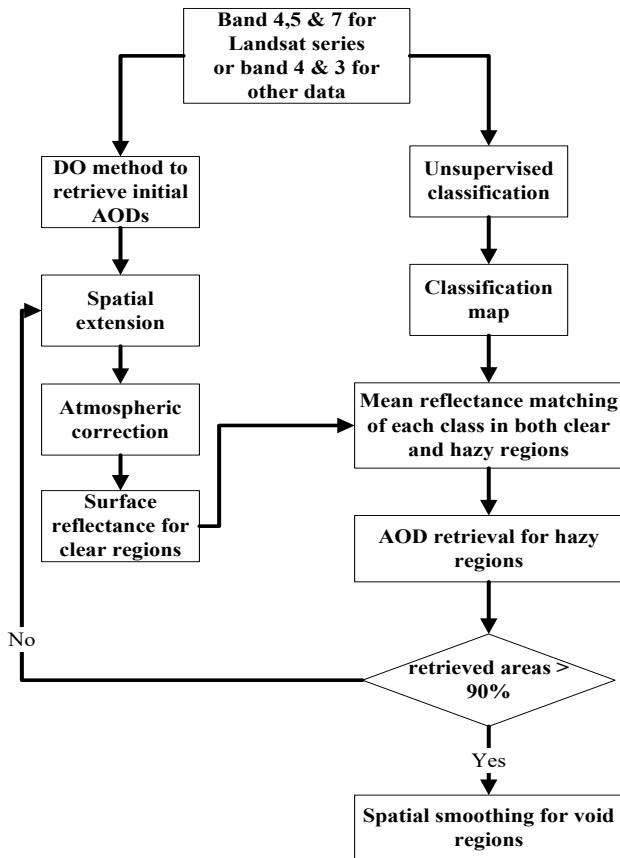
MOD

FY3B/MERSI

MYD



# Atmospheric correction-MH

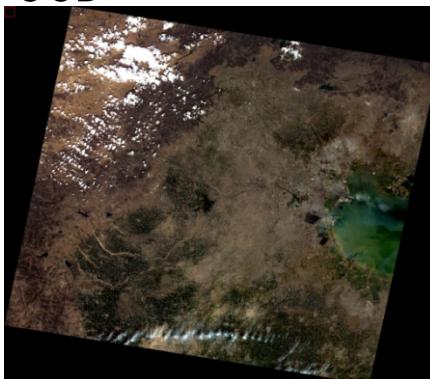
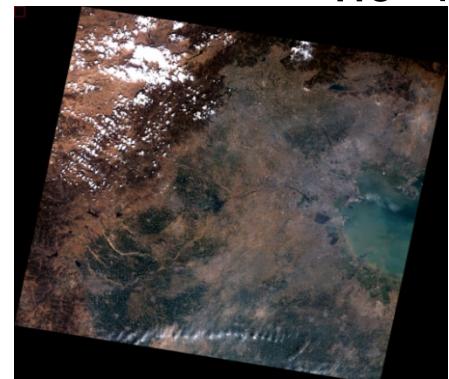


- ✓ Based on signature separation: high frequency land and low frequency atmosphere
- ✓ No other information needed
- ✓ Automated

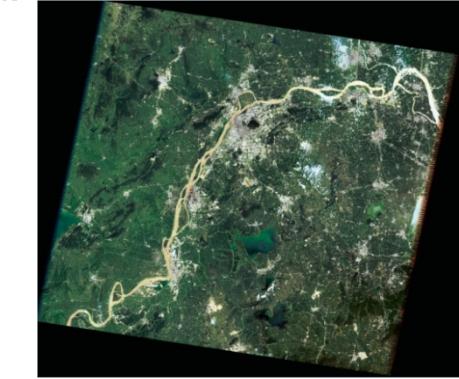
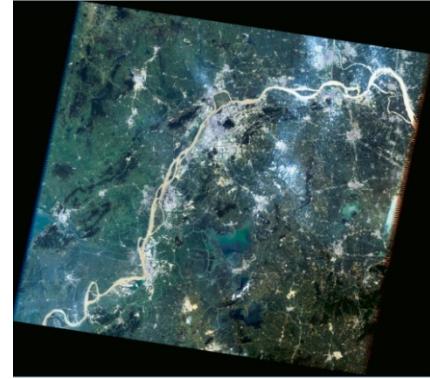


# Atmospheric correction for major moderate to high resolution data

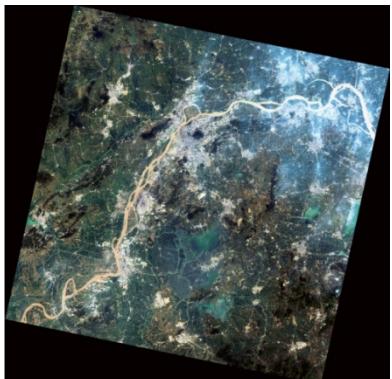
HJ-1/CCD



TM



TM8



ZY3



GEOEYE



THEOS



GF1



## 5. MuSyQ Products



# Production System

- Multi-source data **Synergized Quantitative**  
remote sensing production system
- MuSyQ pronounces **as Music**

# Software and UI

Temporal range setting

Spatial coverage

Product list

The screenshot displays a software window titled "多源数据协同定量遥感产品生产系统". The menu bar includes "File", "数据查询", "原始数据入库", "基础数据入库", "订单管理", "元数据设置", "归一化产品生产", and "定量遥感产品生产". The main area has three sections:

- Temporal range setting:** Shows start date (2014/06/30 13:08:54) and end date (2014/07/10 13:08:54) with dropdown menus, and coordinate inputs (N, S, E, W) with a "Shapefile" button.
- Spatial coverage:** A world map showing landmasses in light purple.
- Product list:** A list of checkboxes for various remote sensing products, with one item checked: "1km植被指数产品(NDVI,EVI)".

At the bottom left, it says "131.45, 104.21 DecimalDegrees".

# Products

## 5km resolution——5

- 5km land surface temperature, MuSQ.LST.5km
- 5km DSR, MuSQ.DSR.5km
- 5km DLR, MuSQ.DLR.5km
- 5km PAR, MuSQ.PAR.5km
- 5km Net radiation, MuSQ.NSR.5km

## 1km resolution——8

- 1km emissivity, MuSQ.LSE.1km
- 1km albedo, MuSQ.LSA.1km
- 1km surface temperature, MuSQ.LST.1km
- 1km DSR, MuSQ.DSR.1km
- 1km DLR, MuSQ.DLR.1km
- 1km PAR, MuSQ.PAR.1km
- 1km AOD, MuSQ.AOD.1km
- 1km net radiation, MuSQ.NSR.1km

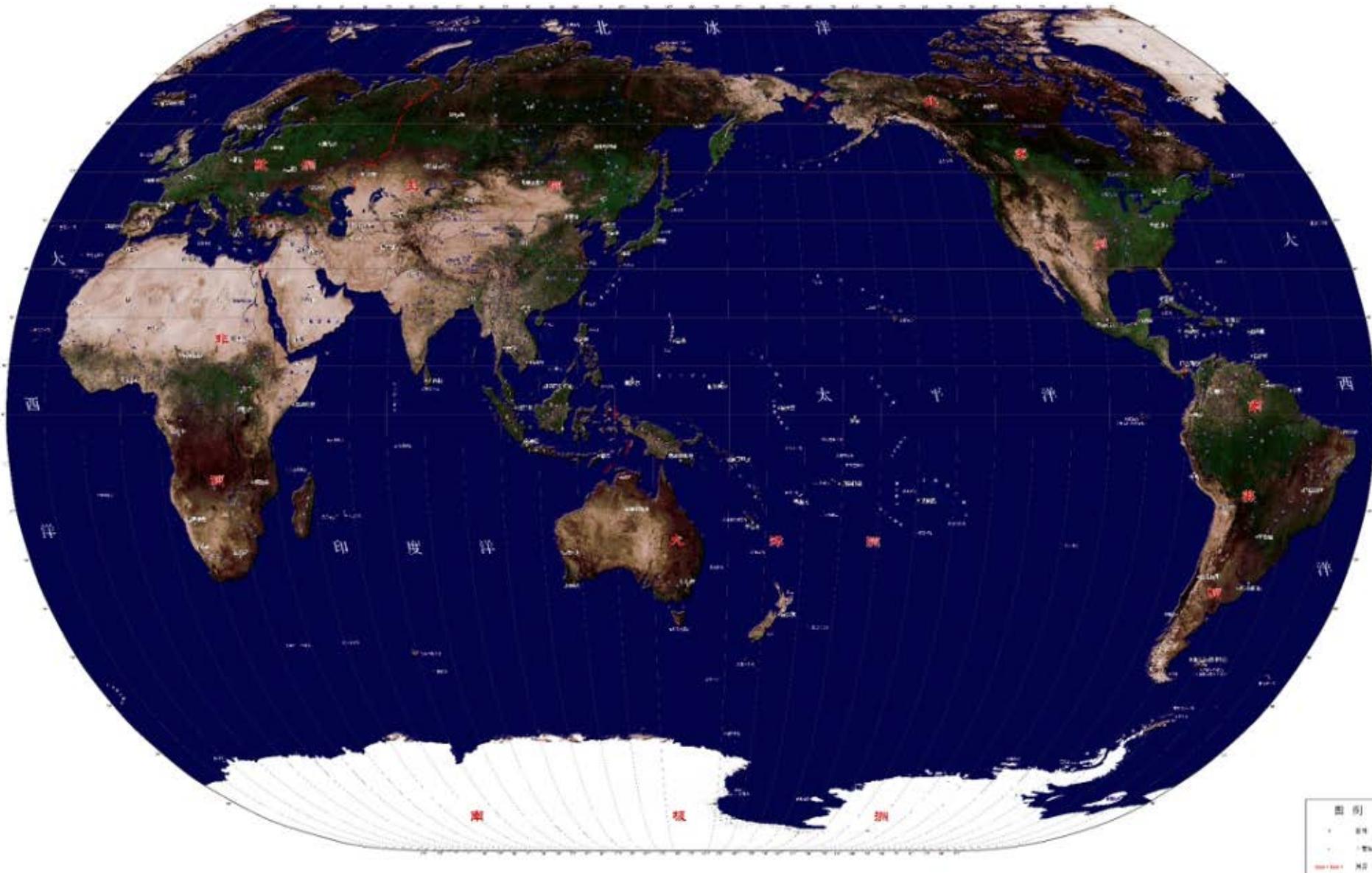
## 300m ——1, 30m——2

- 300m surface temperature, MuSQ.LST.300m
- 30m BRDF/albedo, MuSQ.LSA.30m
- 30m AOD, MuSQ.AOD.30m

# MuSyQ Surface Reflectance Products



# 1 km/5-day composite surface reflectance product day 188-192, 2012



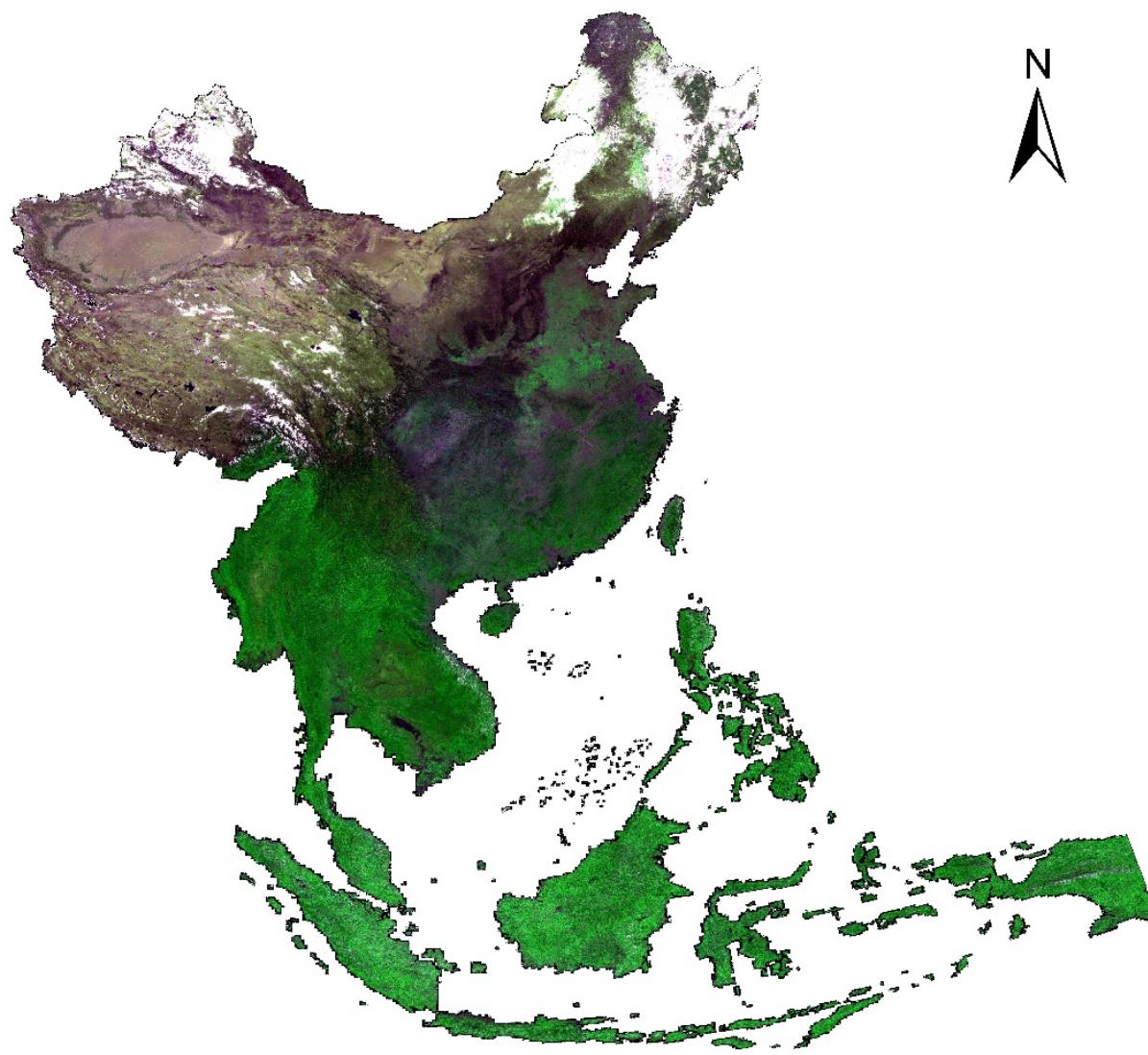
60° E

90° E

120° E

150° E

中国东盟区域1KM—5天合成地表反射率  
(2013年12月2日-2013年12月6日)



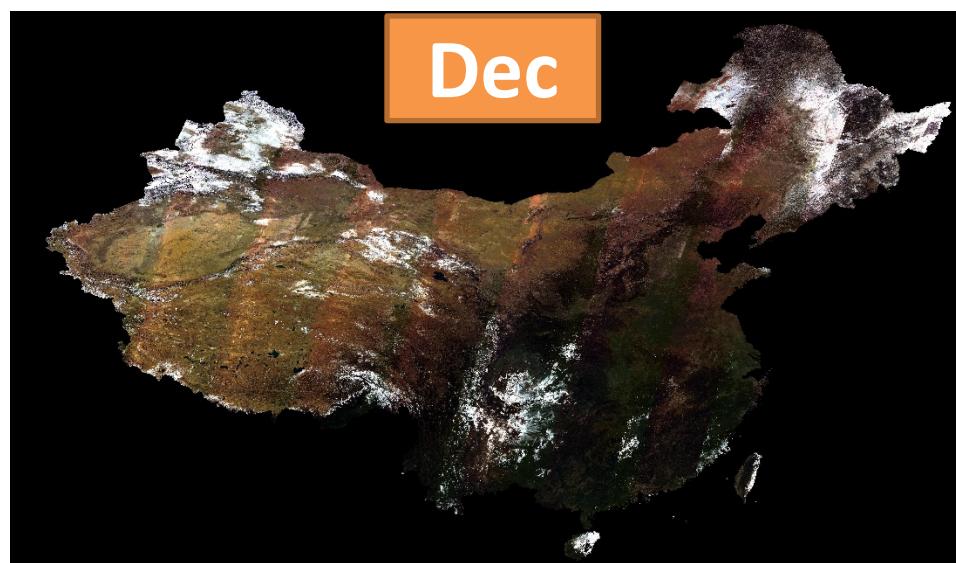
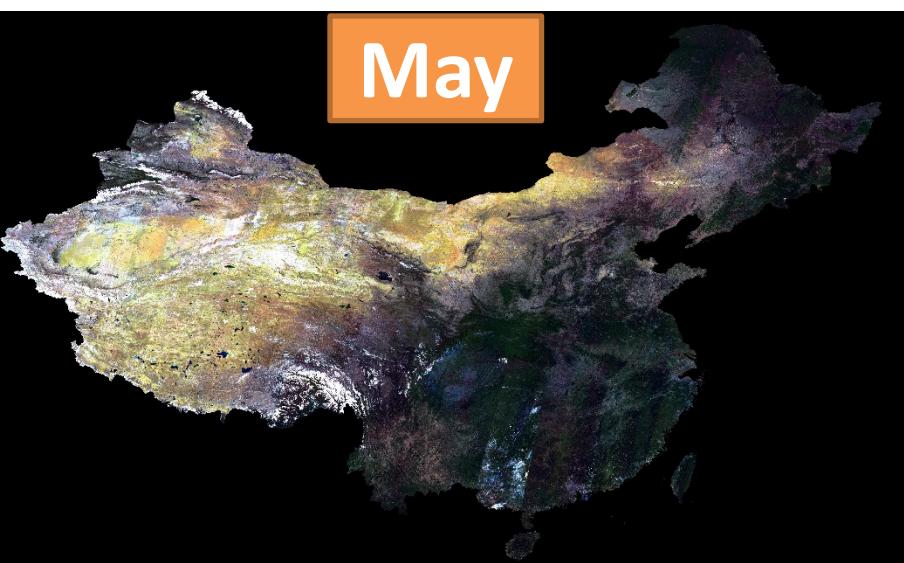
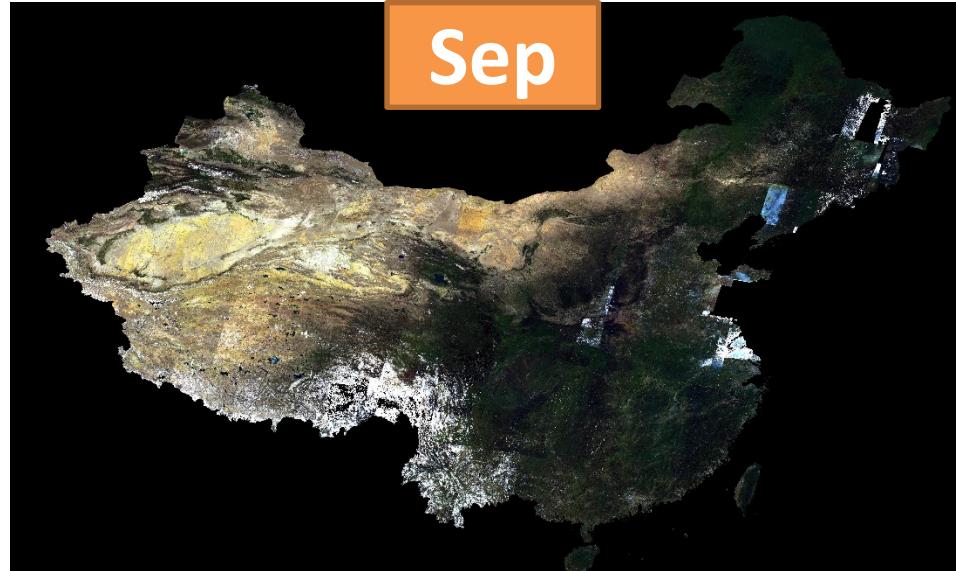
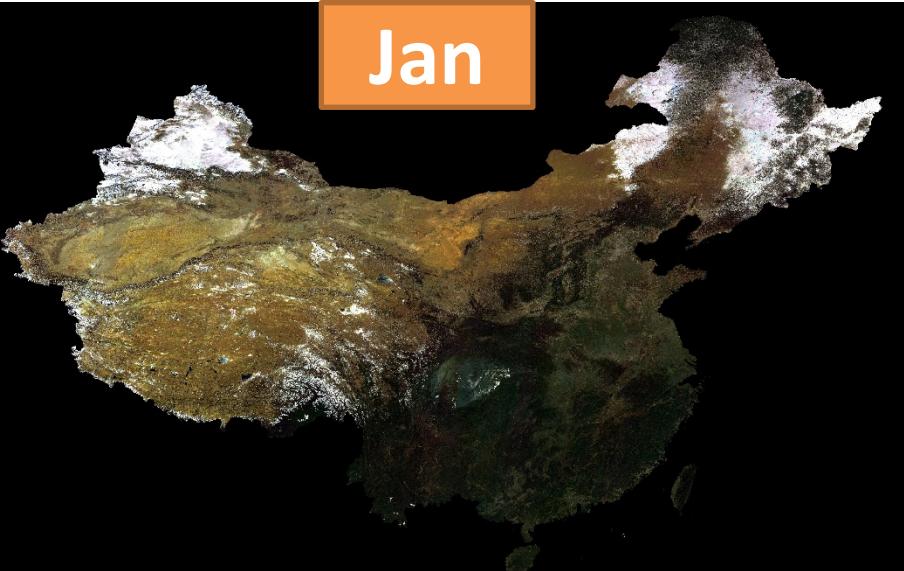
ZHONG et al.2015. Global  
Change Research Data  
Publishing & Repository,  
DOI:10.3974/geodb.2015.  
02.02.V1,  
[http://www.geodoi.ac.cn/  
WebEn/doi.aspx?DOI=10.3974/geodb.2015.02.02.V1](http://www.geodoi.ac.cn/WebEn/doi.aspx?DOI=10.3974/geodb.2015.02.02.V1)

90° E

120° E

# MuSyQ 30m monthly mosaics

--surface reflectance





XinJiang

GanSu



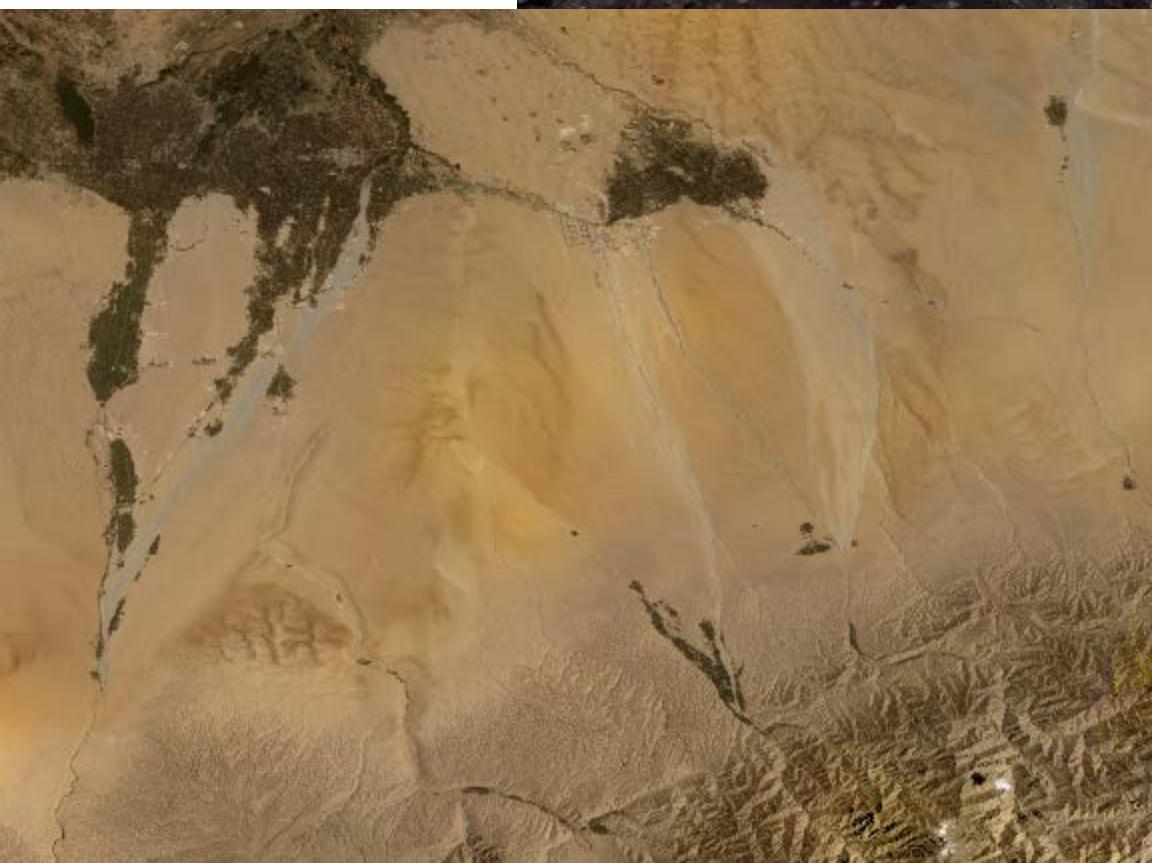


Beijing



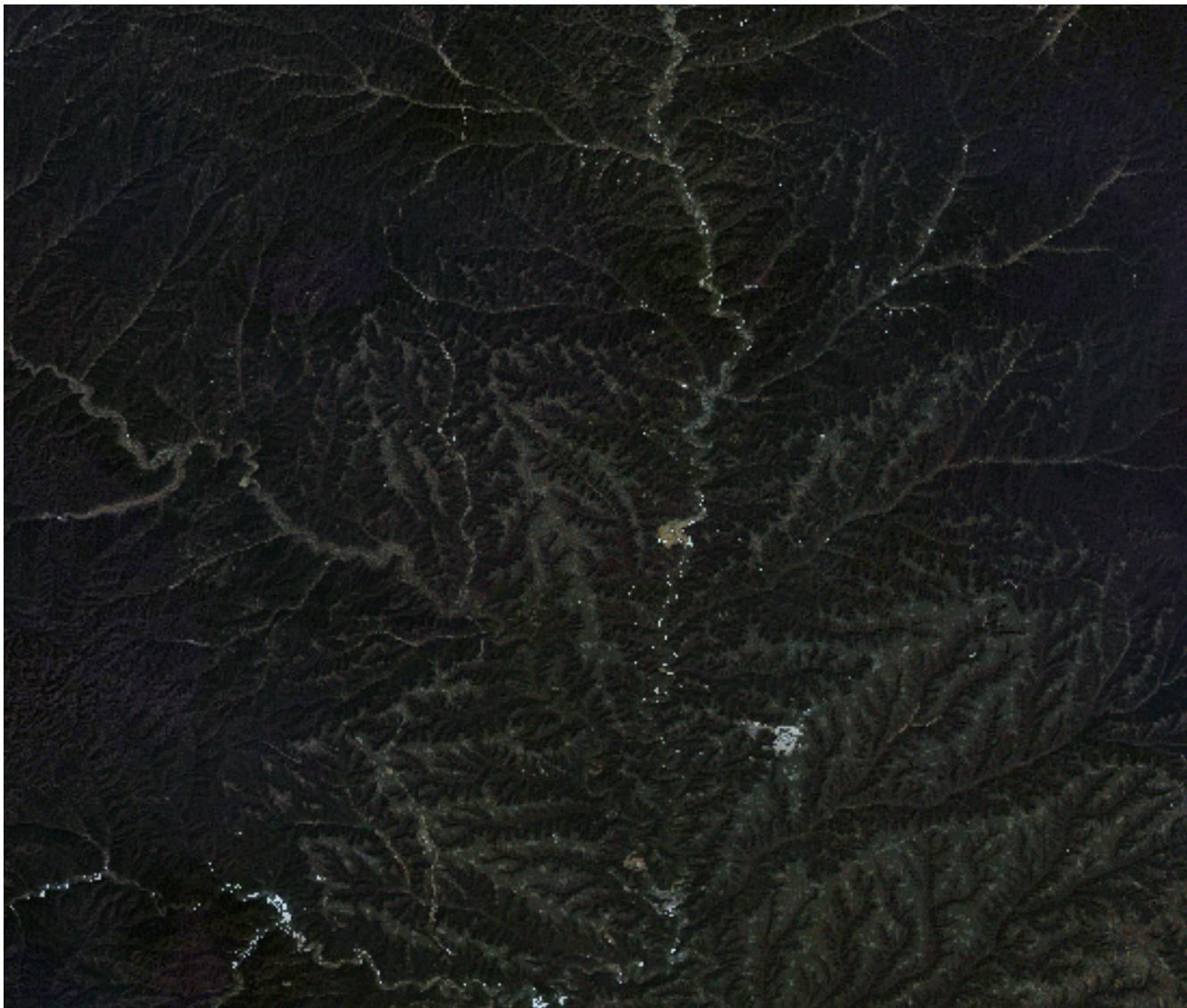
Sichuan

Taklimakan



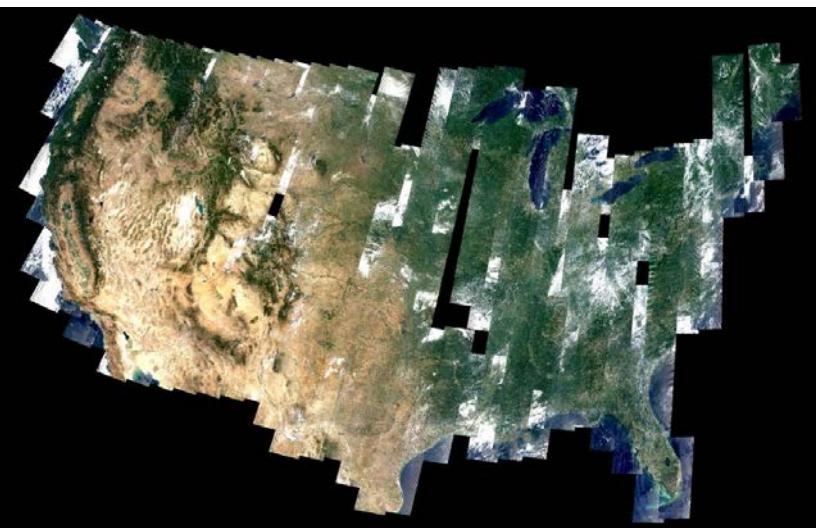
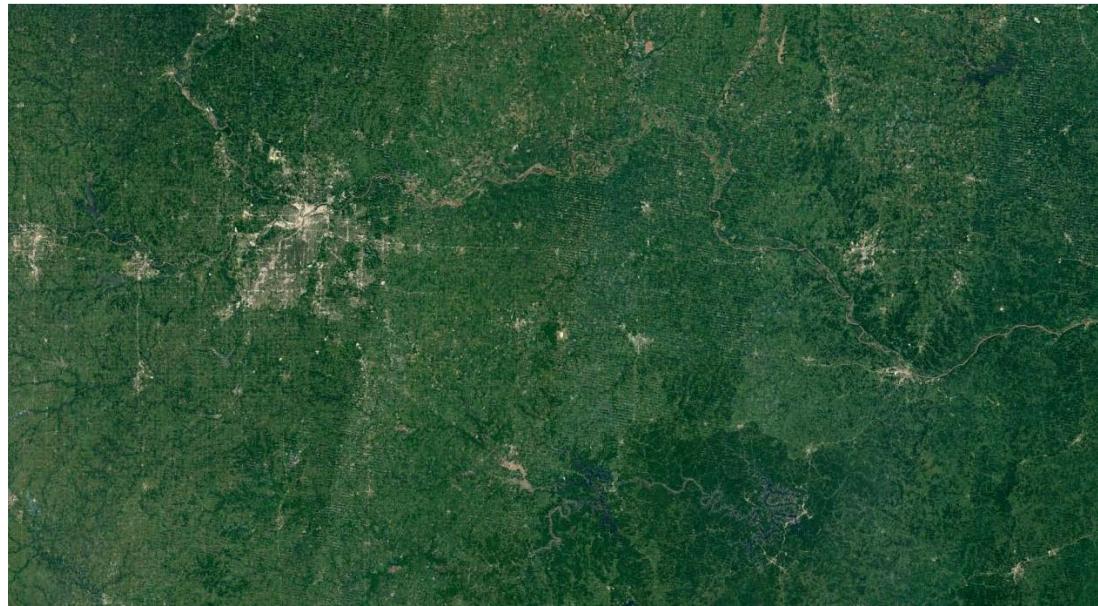
Jilin

# Temporal variation



# WELD 30m mosaics

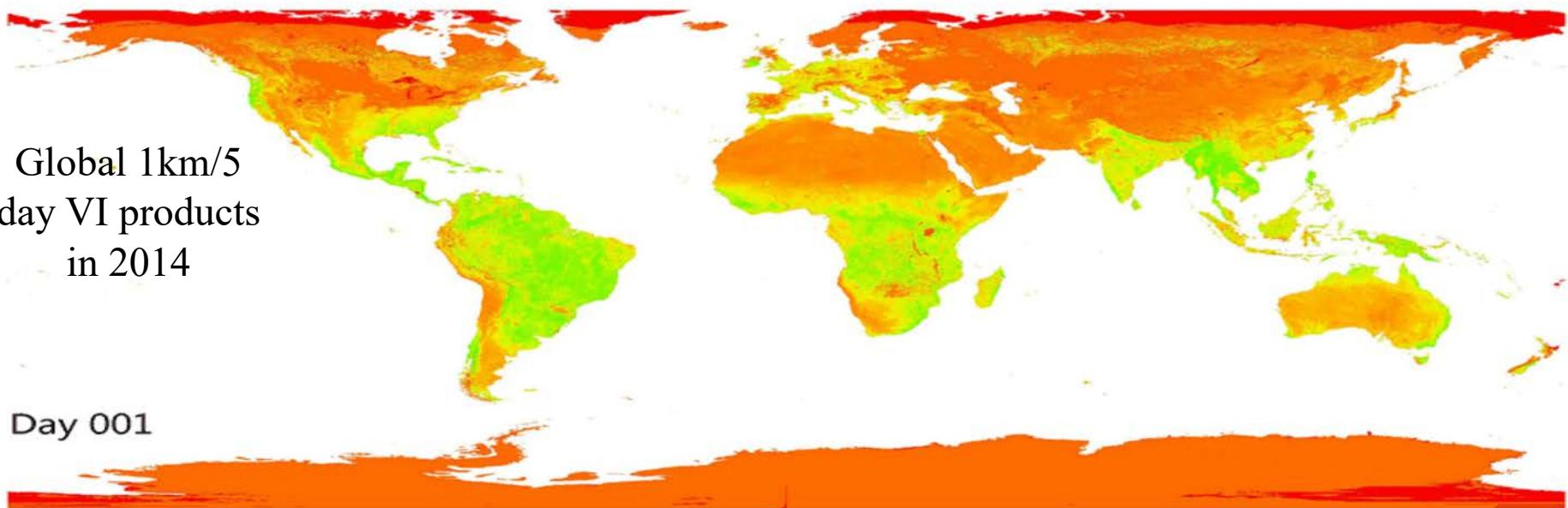
-- apparent reflectance



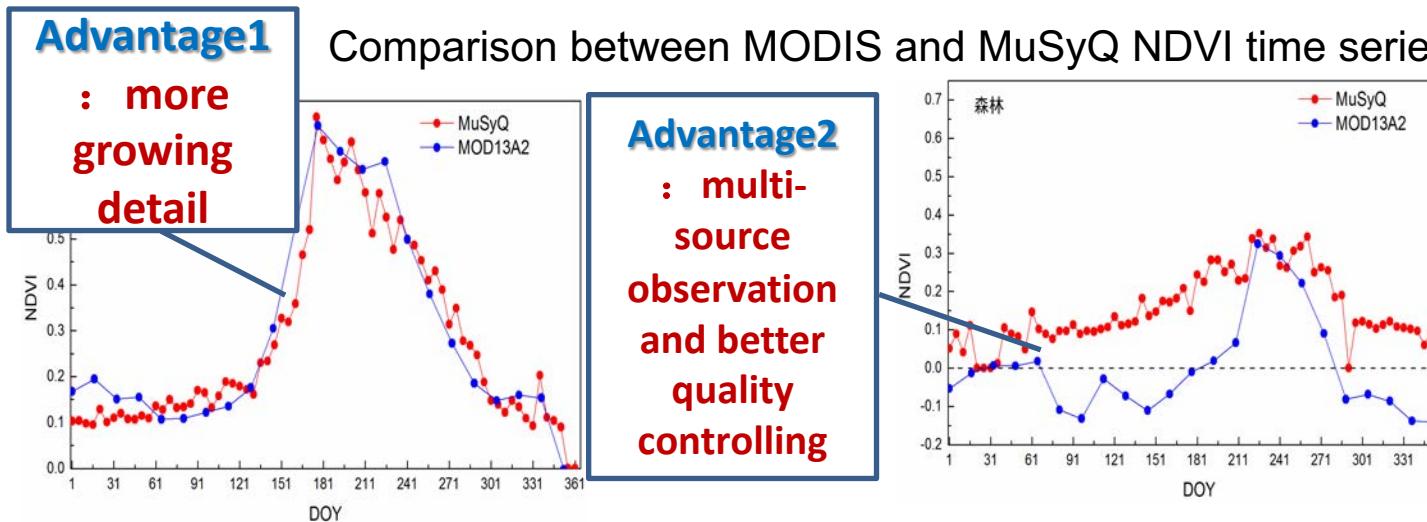
# MuSyQ Vegetation Products



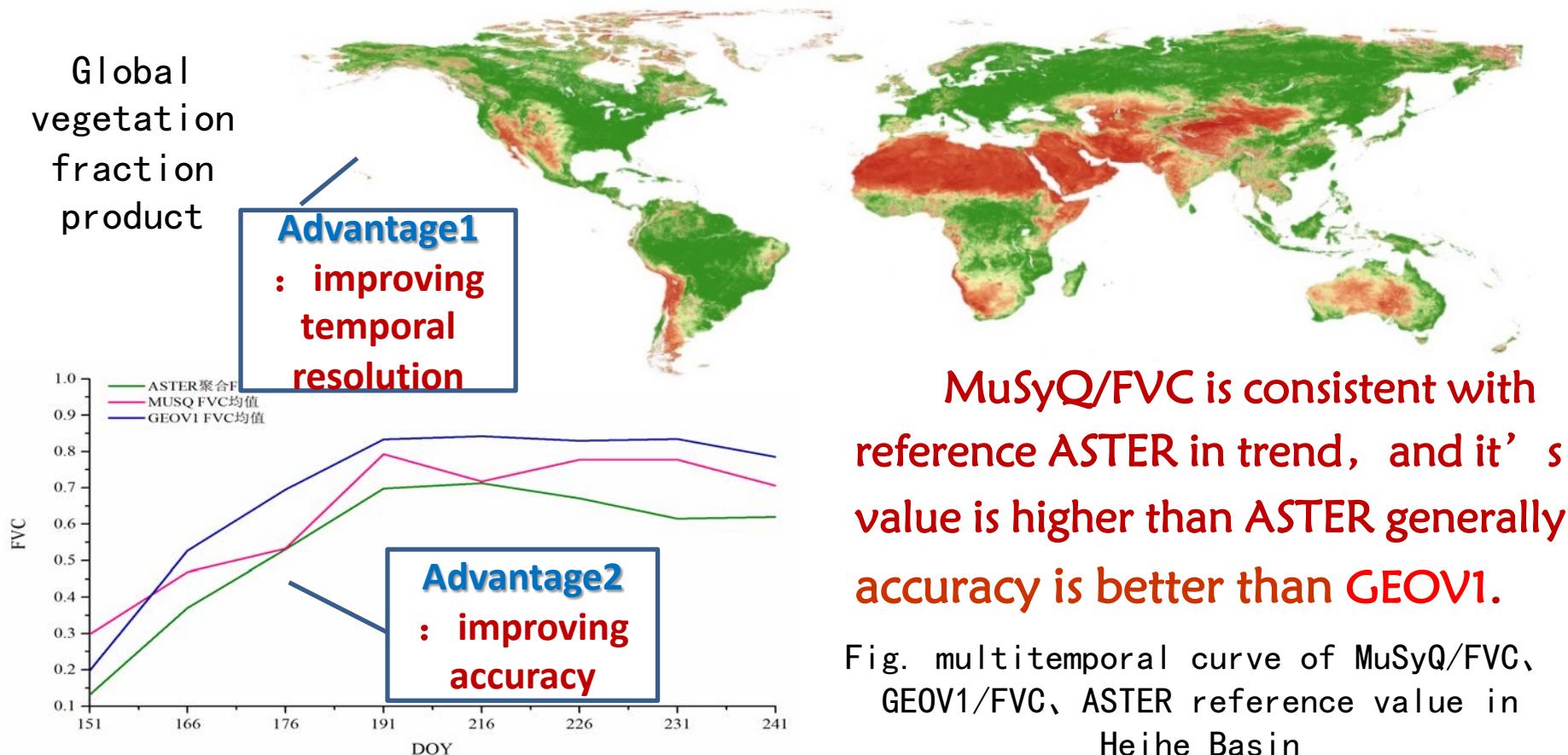
- Global 1km/5 day VI products derived from MODIS, FY3/MERSI multi-source datasets in 2014



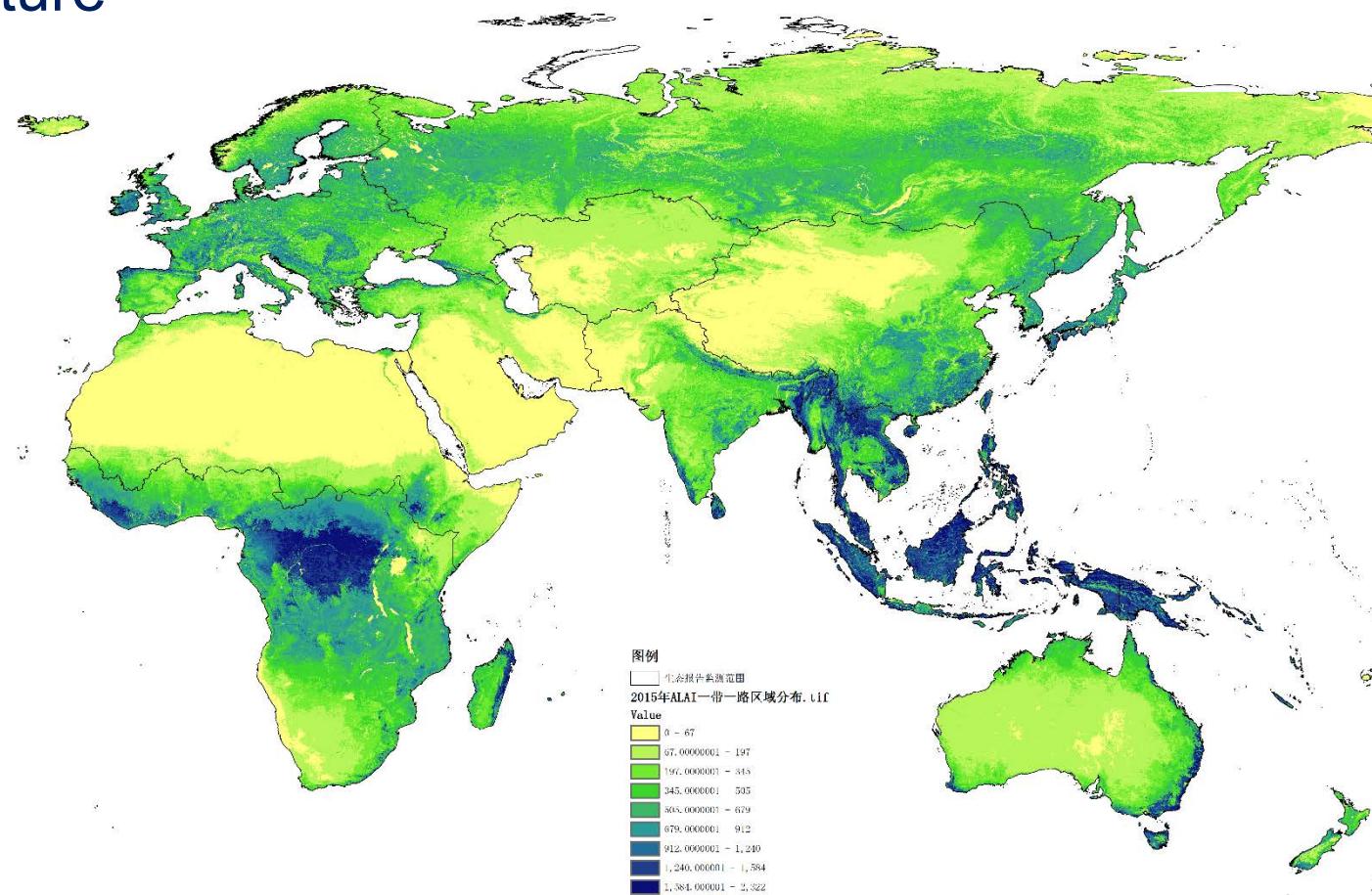
✓ Promote temporal resolution significantly:  
From 16 days to 5 days



- Generating global vegetation fraction product (1km/5days) in 2014 based on global climate regionalization map, land use map and MuSyQ/NDVI product



- Product: 1km/ 5day LAI product over “One Belt and One Road” area generated based on algorithm considering water mixture



# MuSyQ Radiation Products



	product	resolution		enhancements
1	AOD	1km	product	10km to 1km;
		30m	algorithm	
2	DSR	5km	product	1° to 5km
		1km	algorithm	
3	DLR	5km	product	1° to 5km
		1km	product	
4	PAR	5km	product	
		1km	product	
		1km	algorithm	
5	albedo	1km	product	8 days
		30m	product	
6	LST	1km	product	5 days
		5km	product	
7	Canopy temperature	300m	product	
		300m	technique	
8	emissivity	1km	product	
9	Net radiation	5km	product	

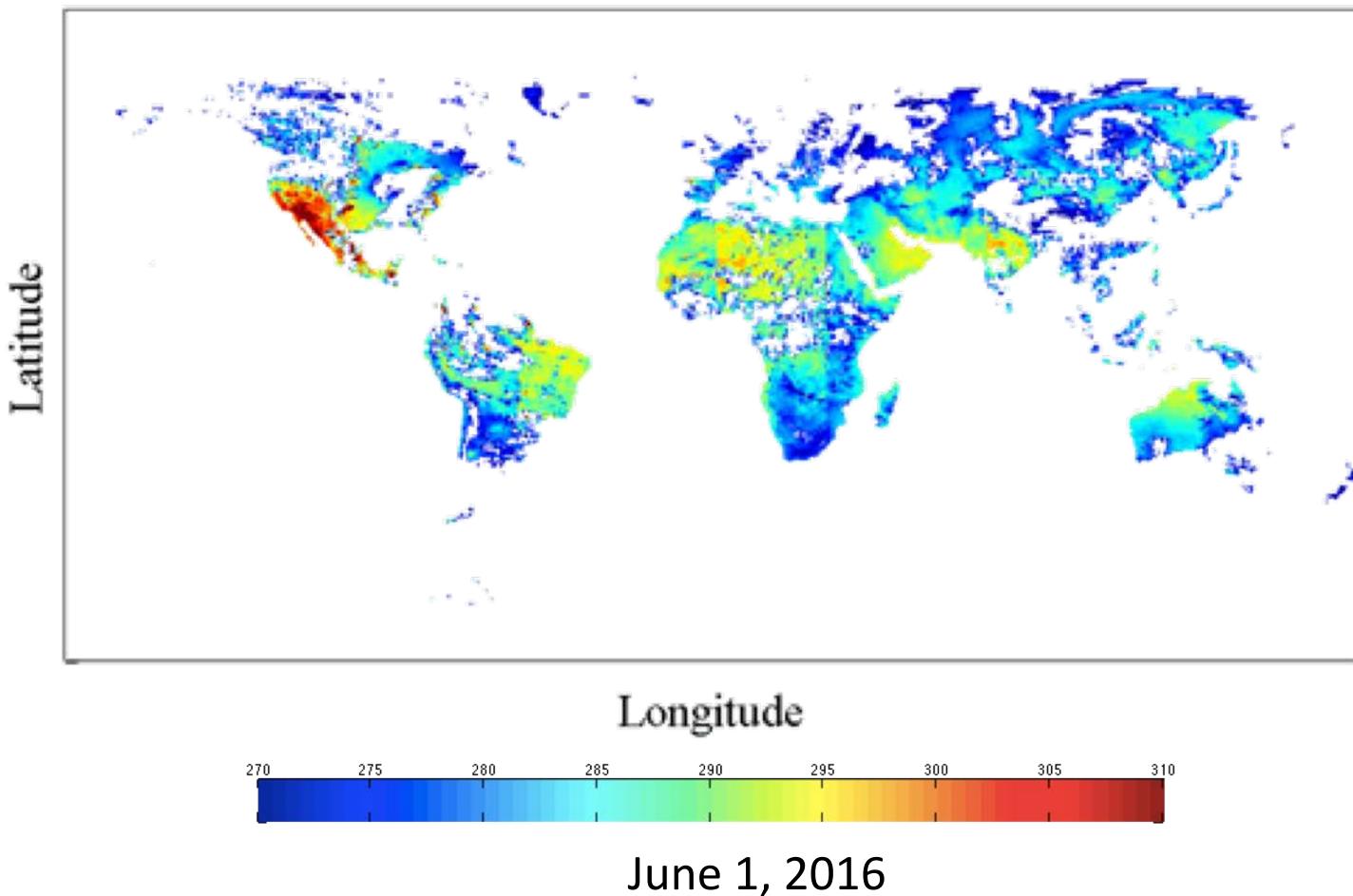
# enhancements

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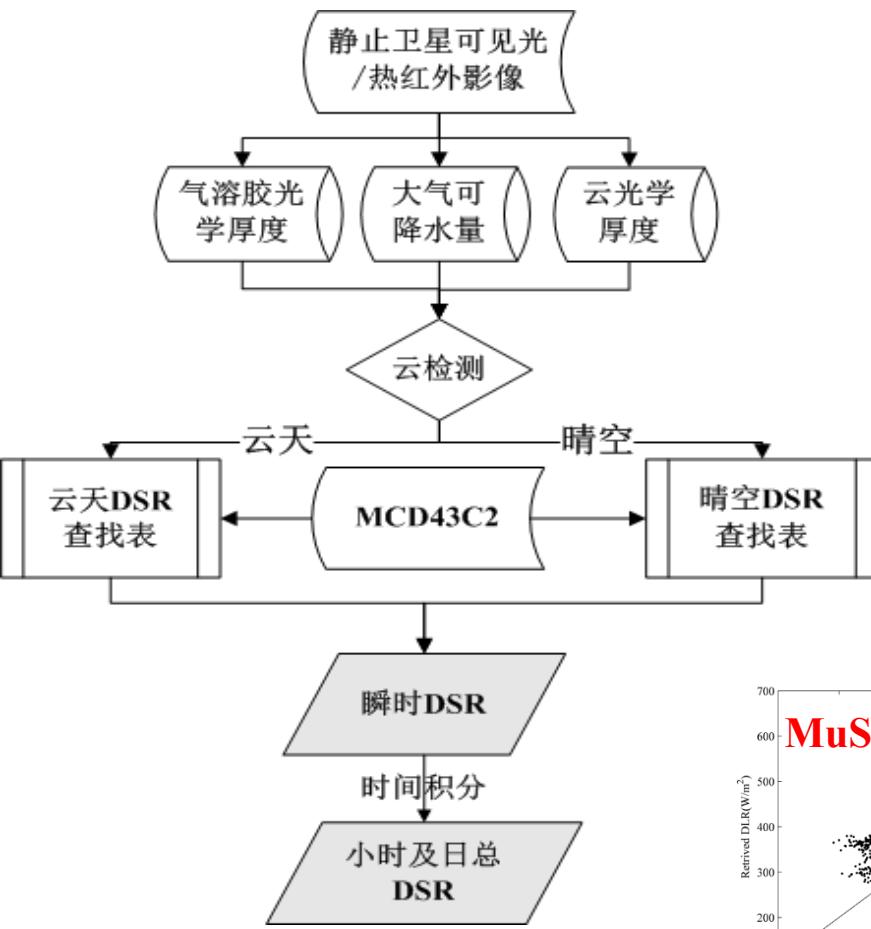
1. a simple model for BRDF/albedo retrieve  
using multi-source remote sensing data  
information evaluation method for multi-source data
2. **Hourly global LST product**  
optimizing split window algorithms, using geostationary satellite data to increase temporal resolution
3. Global coverage high spatio-temporal resolution DSR product

## 2. 5 km hourly global LST product

- Global geostationary satellites networking:  
FY2E/MSG/GOES-13/GOES-15

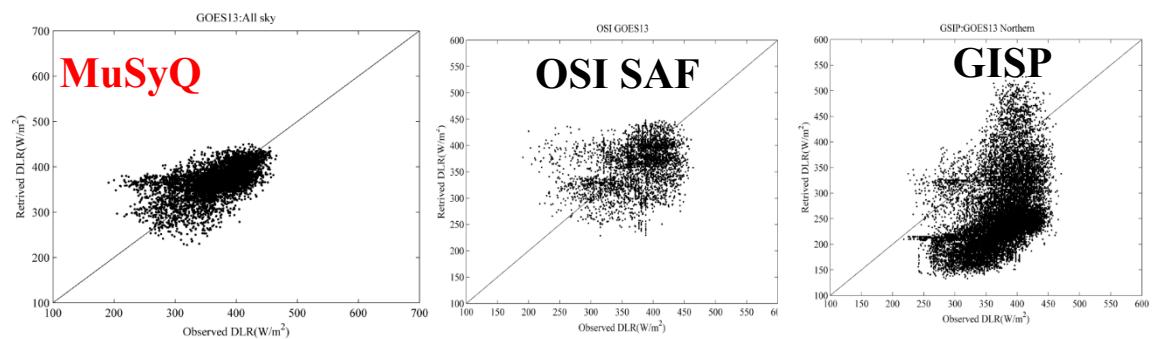
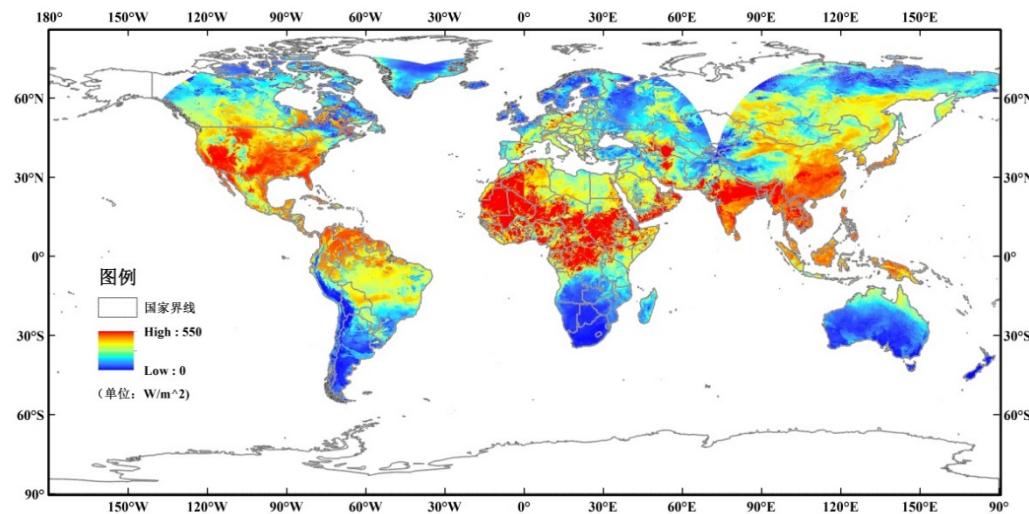


# DSW product from MuSyQ



Algorithm

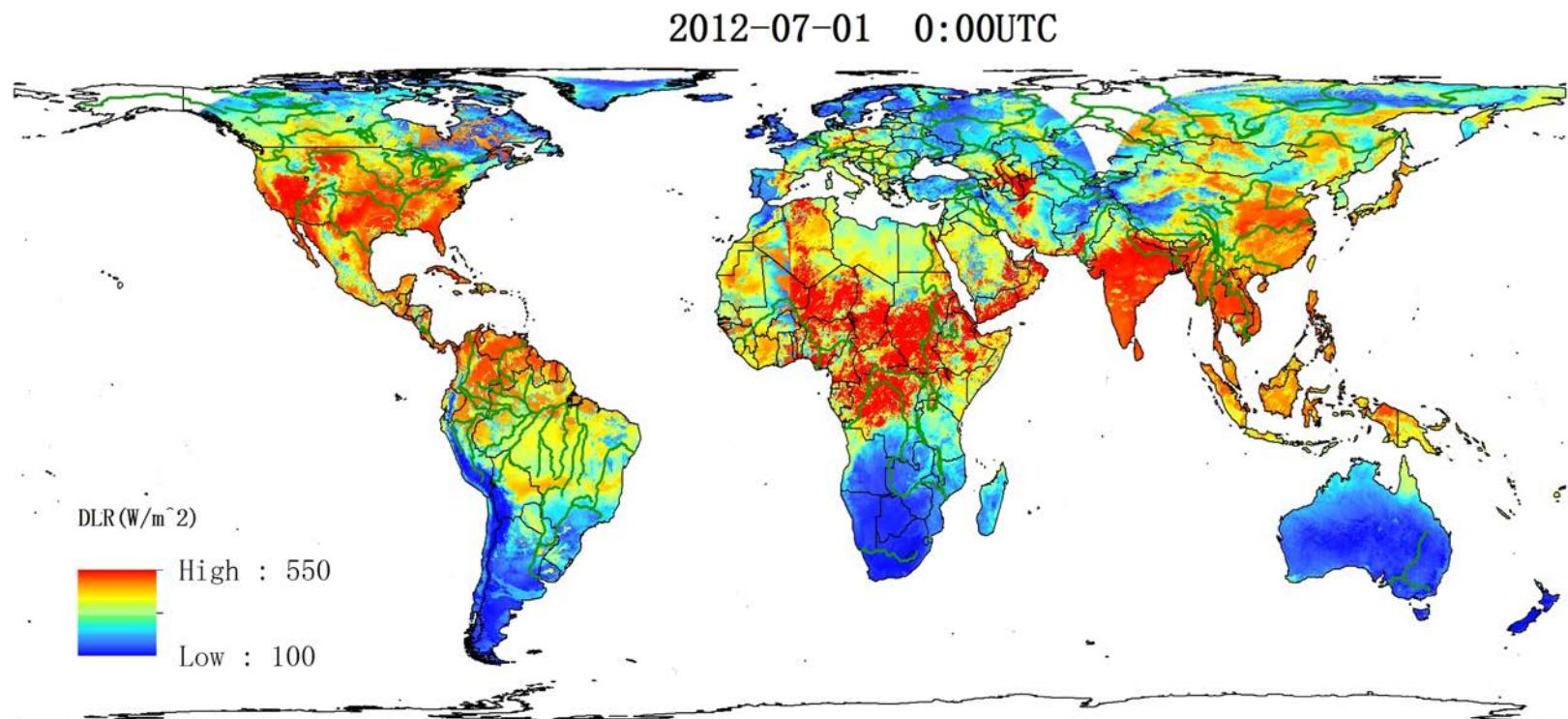
15min ~ 1h, 5km



DLR at American areas

# DLW product from MuSyQ

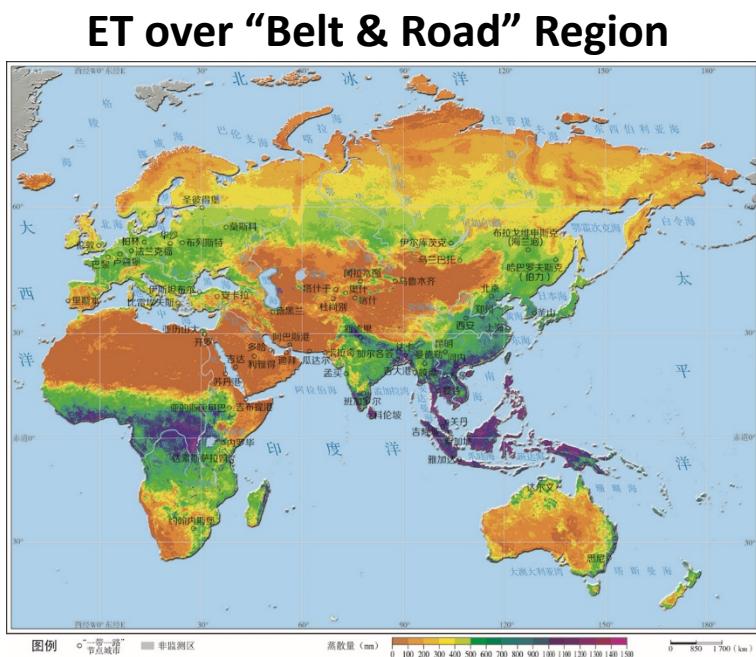
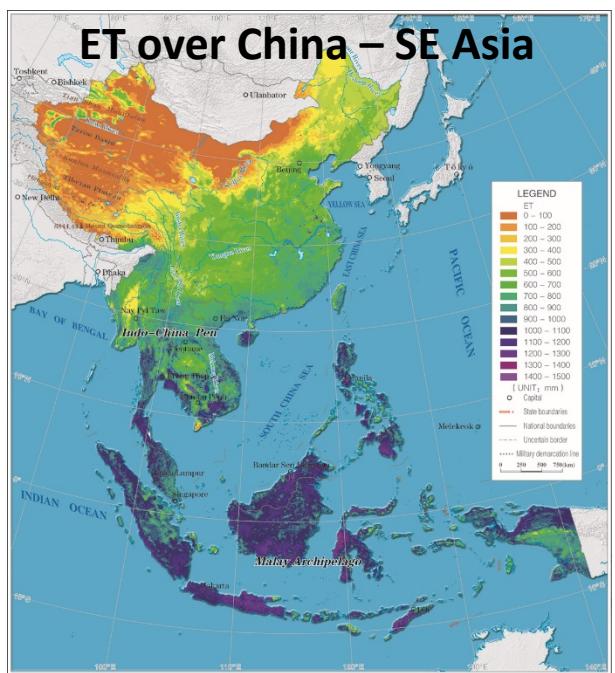
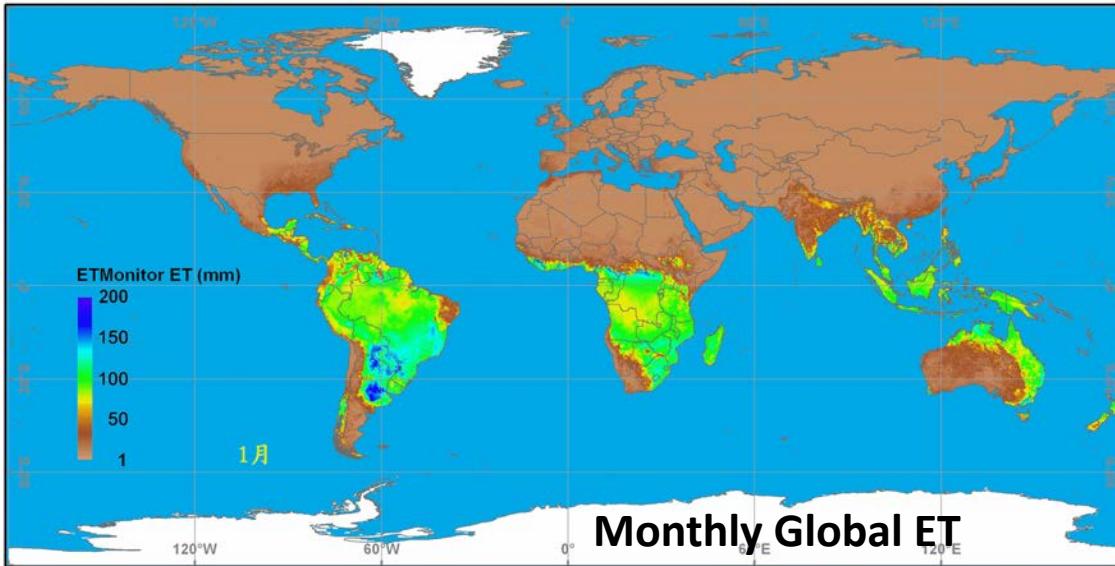
GOES13, MTSAT2, MSG2



# MuSyQ ET Products



# Evapotranspiration Products

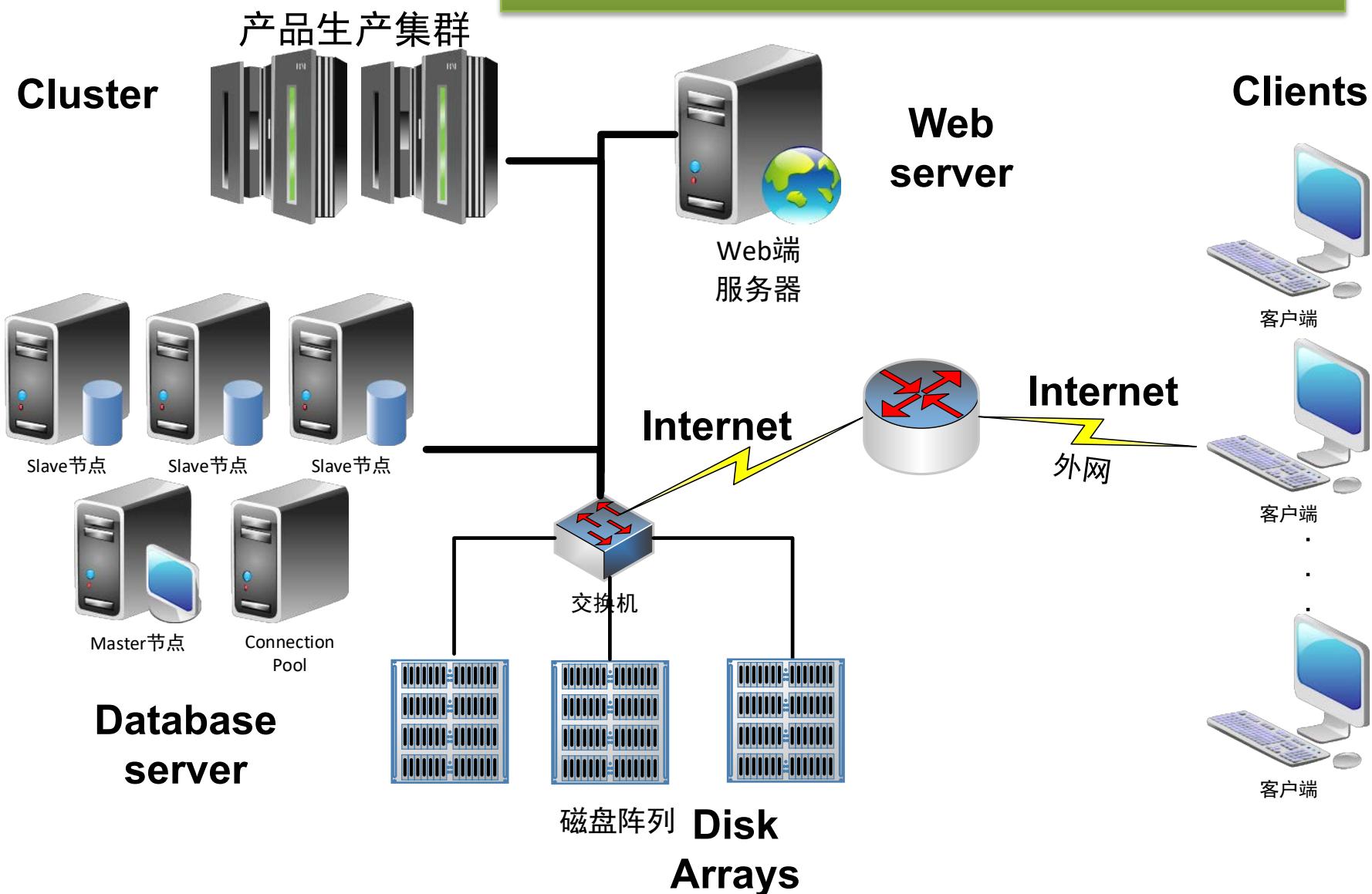


# 6. Hardware

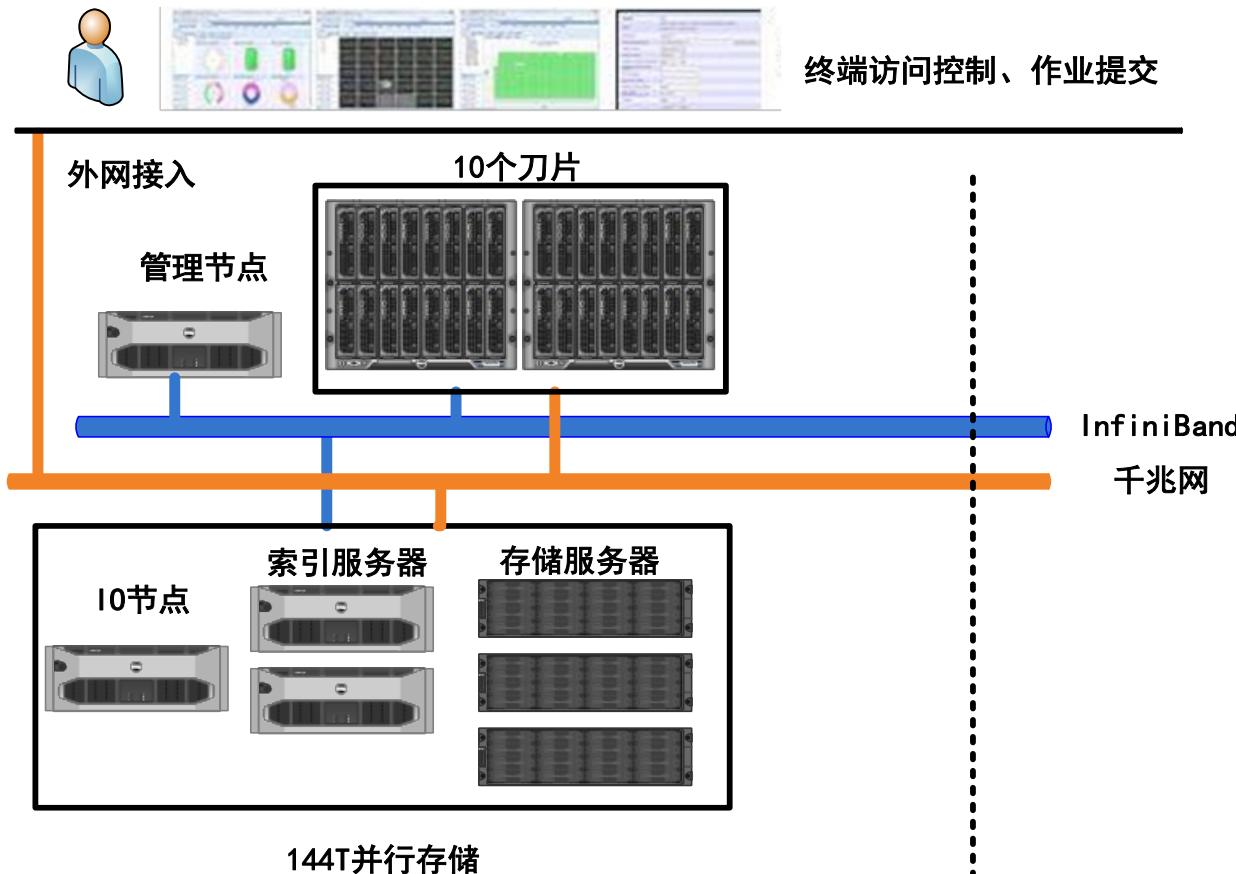


# Cyber infrastructure for global production

## Hardware Architecture



# Super computing configuration



## Center 1

- **16 nodes: 12 CPUs/node, 24GB memo/node**
- **Computing Storage 56TB**
- **Data storage 182TB**

## Center 2

- **20 nodes: 24 CPUs/node, 64GB Memo/node, Computing storage 31TB/node**

# Example: Data acquired and processed

**China and southeast Asia**  
**Moderate to low resolution data(1.5 year)**

Data type	Amount (TB)	Number	Amount after processing (TB)
FY3	5.4T	21266	3.5TB
MODIS	2.69T	18725	5.1TB
MTSAT	2.65T	23338	1TB

- Based on the hardware architecture, these data can be fully processed in just 1 day
- Globally
- Envisat/MERIS, NOAA/MeTop-AVHRR, MSG2, GOES, FY2E
- Trying to lower the interval to 3 days

## 7. Conclusions



# Conclusions

- The technologies for normalizing multi-source remotely sensed data are developed
- The hardware for automatically processing is ready
- The capability for global production is equipped
- The ability for observing the earth in 5 even 3 days at 1km scale is ready to go
- The ability for observing the earth monthly at 30m scale is upcoming

Thank you for your  
attention

and

Questions!